

COMPARATIVE ANALYSIS OF DISPERSION PARAMETER ESTIMATES IN LOGLINEAR MODELING

APPLIED TO E-COMMERCE SALES AND CUSTOMER DATA

SENIOR PROJECT

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Abstract

When loglinear models are applied to count data the issue of over-dispersion often arises. Moment and maximum likelihood estimation methods in accounting for over-dispersion are widely used because they allow for model checking tools such as Chi-square, F, and likelihood ratio tests. Herein is a comparison between R functions that each uses one method; `glm.nb` uses MLE, and `glm.poisson.disp` uses MME. The Index of Dissimilarity and visual model selection (ECDF plots) are also incorporated. These are applied to sales data using product and customer information compiled over the last five years that was generously provided by an e-commerce company.

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1. Introduction

For data that is well represented in a contingency table, by a table of counts, or where there is not a distinct response variable, loglinear modeling is commonly employed to describe the direction and magnitude of association between variables (Agresti 2007, Venables & Ripley 2002, McCullagh & Nelder 1989). It is especially useful for higher-order models or when the variables have many levels. All of the above describe the data analyzed herein. See Jansakul and Hinde for a listing field application and authors.

These data are sales data provided by an e-commerce company and include a wide variety of products with mass appeal. As such, the sales frequencies for the many combinations of covariates can be vastly different from one another. Such large differences make it difficult to account for the variance between different covariate combinations. From the Comprehensive R Archive Network (CRAN, <http://CRAN.R-project.org/>) comes two functions used to model such data: `glm.poisson.disp()` (in `dispmod`; Luca Scrucca 2012, Breslow, N.E. 1984) and `glm.nb()` (in `MASS`; Venables, W. N. and Ripley, B. D. 2002). While both model the data in valid ways—`glm.poisson.disp()` using a Method of Moment (MM) estimator of the parameters, and `glm.nb()` using Maximum Likelihood (ML)—and fit this data very well, they often give opposing directions of association for covariate combinations. This paper briefly discusses the effect on the model from using both R functions and the implications on inference if one is chosen in lieu of another. In addition, results for the main research questions pertinent to the company whose data are used are addressed in depth.

The layout of the paper begins with a description of how the project came about, the data and methods used with a description of the R functions used and a brief of over-dispersion, followed up with a section on model fitting, a discussion of some issues encountered, the results of the sales data, and the summary.

2. Background

In proposing the use of these data for this project, two areas of interest arose. The main question of interest centered on what may influence how long an item stays in inventory of the company. Another aim was to measure how, and in what way, the variables related to one another.

However, these data restricted direct analysis of this question because of the way “avg days in inv” is calculated. It is an average of the days in inventory for all of the items of a specific type received by the warehouse for any of the drops to the warehouse (a *drop* occurs twice a day and is when the system that processes orders releases them to the warehouse for fulfillment). As such, this value may incorporate storage time from different/multiple supplier shipments to the warehouse. Also, without distinction for items that are drop shipped or pre-sale (put on sale before being received to the warehouse), there is no clear way to distinguish in this analysis and beyond summary statistics if, or in what way, the average days in inventory is affected by the characteristics of products or customers. Also, with respect to storage time, because the data do not make distinctions among unique customers, there is no way to analyze differences between specific combinations of customer characteristics related to particular products. Thus, any interpretations of results from such an investigation may be spurious. However, what was able to be addressed was the strength and direction of associations between a selected subset of variables.

3. Data & Methods

3.1 The Data

The original data file contained 1,186,929 observations. Each observation contains up to 25 variable descriptions. From this file, SAS 9.2 was used for data management, reducing the number of variables to six whose unique non-zero combinations were counted and exported using PROC SQL with analysis carried out using R 2.11.1. There are 2,490 such combinations whose frequencies are studied.

Below are the descriptions of the variable of interest. Each product manufacturer is listed under Brand. Channel refers to the sales channel that the product is sold through. *Agg_channel* is comprised of Club CPO: Phone, Club CPO: Web, Other, Outlets: Phone, Outlets: Web, Press.Wash: Phone, Press.Wash: Web, Reconditioned Tools: Web, Reconditioned Tools: Phone, Tool Crib: Phone, Tool Crib: Web, and Wholesale. A customer's gender is given by Sex, and the original levels were aggregated as follows: *unknown* and *ambiguous* as Unknown; *female* and *probably female* as Female; *male* and *probably male* as Male. A product's sales condition is either New or Reconditioned. The descriptions for a tool being cordless or corded are obvious.

| | | | | | | | |
|-----------|-------------------------|--------------------------------------|---------------------|--------------|----------------------|-------------------|--------|
| Brand | Black & Decker | Fein | Makita | Powermatic | Bosch (Ref level) | Festool | Metabo |
| | Ridgid | Bostitch | Homelite | Milwaukee | Ryobi | Campbell Hausfeld | Jet |
| | Panasonic | Senco | Delta | Karcher | Porter Cable | Skil | Dewalt |
| Channel | agg_channel | Branded Web (Ref level) | Phone | Amazon Sales | eBay Sales | | |
| Sex | Unknown | Female | Male (Ref level) | | | | |
| Income | High (\$75k- 200k+) | Middle (\$30k-75k) (Ref level) | Low (-\$10k-20k) | | | | |
| Cordless | Cordless (Ref level) | Not Cordless | | | | | |
| Condition | New (Ref level) | Reconditioned | | | | | |

Table 1. Listing of variable names and levels.

3.2 Methods

For data that is well represented in contingency tables, loglinear modeling may be employed as a way to assess associations between any, or all, of the variables under consideration. Loglinear models extend inference beyond 2-way contingency tables to multi-way tables where the conditional relationship between two or more discrete, categorical variables is analyzed by taking the natural logarithm of the cell

frequencies. It allows for interpretations of the strength and direction of relationships in these tables. What is being modeled is the estimated *effect* on the frequency by unique groupings as shown by the strength of the association between one or more variables in each group. As is the case in this analysis where we have multiple two-variable interactions, the association between any two variables, given some fixed level of the other four variables, has either a positive or negative effect on the expected number of times this unique grouping appears in the data set. It may also be said that the effect on the estimated cell frequency of one customer-product specification is x -times higher or lower when compared to the reference group. Often, due to the complexity of interpretations or relevance, only one variable level at a time will be adjusted. For instance, to compare different brands the remaining five variable levels will remain the same for both brands; given these fixed levels, Brand A is associated with an increase (decrease) in the estimated odds of a sale compared to Brand B.

The Poisson distribution assumes the mean and variance of the response are equal. The extra-variation, referred to as extra-dispersion (in this case, strictly over-dispersion), inherent in this data violate this assumption. This necessitates the need to estimate a dispersion parameter. Two methods for estimating dispersion were used—`glm.nb` and `glm.poisson.disp`—because it was not clear to me how well either would model the data.

Model selection was based forward/backward stepwise selection and ANOVA process to what difference between the two functions there were and the interactions it deemed important. Stepwise selection for both functions identified the Income by Cordless interaction for removal. ANOVA selection in `glm.nb` further identified the Sex x Cordless for removal. For comparative purposes the stepwise selections were used.

The models estimated excluded the interaction between a person's income and whether or not an item was cordless. This exclusion implies conditional independence between these two variables given the other variables, meaning that the association between the two variables does not depend on any others (Agresti 2007). The interactions included in both models are:

| | | |
|-------------------|---------------------|----------------------|
| Brand : Channel | Channel : Income | Cordless : Condition |
| Brand : Income | Channel : Sex | Income : Sex |
| Brand : Sex | Channel : Cordless | Income : Condition |
| Brand : Cordless | Channel : Condition | Sex : Cordless |
| Brand : Condition | | Sex : Condition |

Table 2. 2-Way interactions included in both models.

Since there are a prohibitive number of model parameters to express in an example of the model equation, the general form for loglinear models is given next:

$$\log \mu_{ij} = \lambda + \lambda_i^A + \lambda_j^B + \lambda_{ij}^{AB}, \text{ or}$$

$$\log(f_i) = \beta_0 + \beta_1 x_{1i} + \dots = \boldsymbol{\beta}^T \mathbf{x}_i$$

where μ_{ij} is the mean response of the effect λ_{ij} for covariates A and B, and where f_i is the estimated frequency of the mean response $\boldsymbol{\beta}^T \mathbf{x}_i$, where \mathbf{x} is the and $\boldsymbol{\beta}$ are the usual linear predictors.

3.3 Functions

`glm.nb`

This function uses an iteratively weighted least squares algorithm for estimating over-dispersion. A benefit of `glm.nb` is that it defines the variance as a gamma random variable which, in allowing the variance to be quadratic, better accounts for the tremendous variation in the observed data. Taking the Poisson mean as a gamma distributed random variable leads to the NB model and we can obtain a quadratic mean-variance relationship when the shape parameter is held constant and letting the scale parameter vary (Jansakul and Hinde 2002). Thus the negative binomial distribution is known as a Poisson-Gamma mixture (Ma 2011).

For instance, suppose that the random variable Y_i represents frequencies of sales with means θ_i for each combination of covariates in a fixed period of time. Because of the uncertainty in θ , it should itself be regarded as a random variable. The following uses a parameterization given by Hinde and Demétrio 2007: The Poisson-Gamma mixture with $Y_i \sim \text{Poi}(\theta_i)$ where $\theta_i \sim \text{Gamma}(k, \lambda_i)$ has a negative binomial distribution for the Y_i :

$$f_{Y_i}(y_i | \mu_i, k) = \frac{\Gamma(k + y_i)}{\Gamma(k) y_i!} \frac{\mu_i^{y_i} k^k}{(\mu_i + k)^{k+y_i}}, \quad y_i = 0, 1, \dots$$

and $\mathbf{E}(Y_i) = k/\lambda_i = \mu_i$ with $V(Y_i) = \mu_i + \mu_i^2/k$.

The estimation of k addresses over-dispersion, and is commonly denoted $\phi = \frac{1}{\theta} = \frac{1}{k}$. Note that by estimating θ rather than ϕ directly guarantees the existence and uniqueness of the likelihood function, allowing $\boldsymbol{\beta}$ to be estimated by maximum likelihood (Aragan 1992).

`glm.poisson.disp`

The author of this function utilized an iterative algorithm that uses a moment method giving the unbiased estimating equation (Breslow 1984)

$$\sum_{i=1}^n \left\{ \frac{(y_i - \mu_i)^2}{\mu_i \left(1 + \frac{\mu_i}{k}\right)} - 1 \right\} = 0.$$

This equates to solving $X^2 = n - p$ where X^2 is the generalized Pearson X^2 statistic. Combining this with weighted Poisson regression, Breslow proposed estimating β using the weights, $w_i = 1/(1 + \hat{\mu}_i/\hat{k})$, obtained from the previous iteration (Hinde and Demétrio).

3.4 Over-dispersion

Two potential causes of over-dispersion in this data may be that a variable for time and/or a variable for customer location are not considered. Heterogeneity or dependence among clusters of data, whether temporal or spatial, violates the Poisson assumption and can cause over-dispersion (Agresti 2007). Figure 1 shows how spread out the data are. The range of sales frequencies is quite broad; there are 154 unique covariate combinations appearing once, and a single unique observation appearing 48,245 times.

The mean of the frequency is 352.5261 with a variance of 2,473,575. While the data clearly violates $E(Y_i) = V(Y_i)$, Table 3 shows vastly different test statistics and similar, though not comparable, estimates of the dispersion parameter ϕ . They are not directly comparable because both models estimated different parameters due to singularities. These model differences are discussed in Section 4.4 and referenced, in part, in the IBM documentation.

| Model | Function | Test Stat | p-value | $\tilde{\phi}$ (se) |
|-------------------|-------------------------------|-------------------------------------|--------------------|---------------------|
| 2-Way Interaction | <code>glm.poisson.disp</code> | $z = 33.4573$ | $< 2.2\text{e-}16$ | 0.18798 (-) |
| 2-Way Interaction | <code>glm.nb</code> | $\frac{1}{2}X^2_{(1)} = 38365.1544$ | $< 2.2\text{e-}16$ | 0.16107 (0.227) |

Table 3. Test of over-dispersion results.

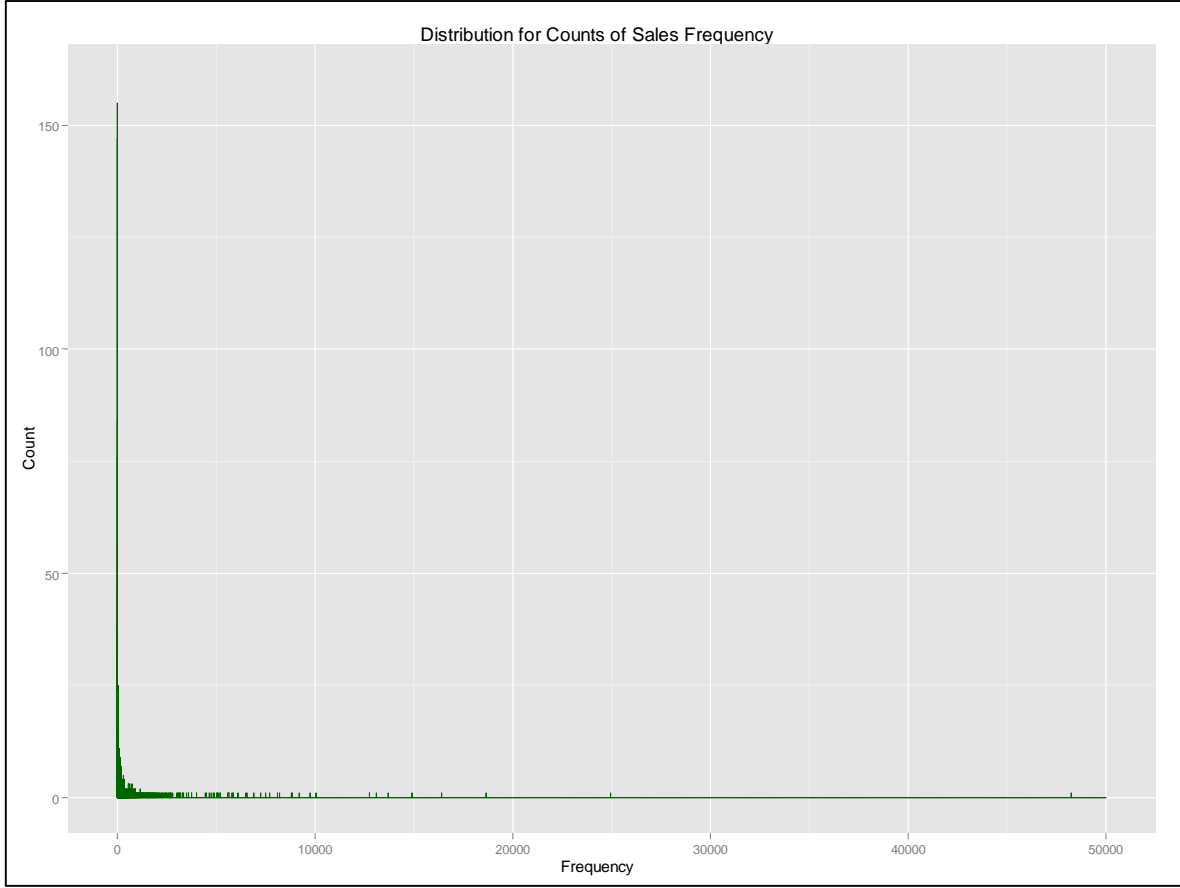


Figure 1. Distribution of counts of covariate frequencies.

4. Model Fit

4.1 Dissimilarity

When checking the fit between models significant differences may be of little use because the large sample size makes goodness-of-fit tests very sensitive in detecting the smallest effects. The Dissimilarity Index (DI) summarizes the closeness of model fit irrespective of sample size. Its summary represents the proportion of observations that need to be moved to create a perfect fit.

For a table of arbitrary dimension with cell counts $\{n_i = np_i\}$ and fitted values $\{\hat{\mu}_i = n\hat{\pi}_i\}$, let

$D = \sum |n_i - \hat{\mu}_i| / 2n = \sum |p_i - \hat{\pi}_i| / 2$, where D takes values between 0 and 1. Smaller values of D indicate a better fitting model in a more practical sense (Agresti 2007). While this index is well suited for comparing higher and lower order models, in this case it is used to help distinguish differences between

the two functions. For these data, higher order models were either not relevant or significant enough to consider. Table 4 shows that with a lower DI value the MM estimated model is slightly better than the ML model. Also see Kuha and Firth 2010 for more information on the index.

| Model | Function | Dissimilarity |
|-------------------|-------------------------------|---------------|
| 2-Way Interaction | <code>glm.poisson.disp</code> | 0.3514 |
| 2-Way Interaction | <code>glm.nb</code> | 0.3837 |

Table 4. Dissimilarity index values. Smaller values indicate better fit.

4.2 Visual Model Fit

The moment estimated model has a lower deviance yielding a better, but somewhat heuristic, lack-of-fit statistic (Table 5).

| Model | Function | AIC | Deviance | DF | LOF (Dev/df) |
|------------------------|---------------------------------------|-------|-------------|------|-----------------|
| All 2-Way Interactions | <code>glm(..., family=Poisson)</code> | 60971 | 46682 | 2230 | 20.9336 |
| Additive | <code>glm.poisson.disp</code> | 2520 | 2026 | 2459 | 0.8239 |
| 2_Way (Reduced) | <code>glm.poisson.disp</code> | 4602 | 2132 | 2232 | 0.9552 |
| Additive | <code>glm.nb</code> | 25924 | 2751 | 2459 | 1.1187 |
| 2_Way (Reduced) | <code>glm.nb</code> | 22622 | 2653 | 2232 | 1.1882 |

Table 5. Deviance and fit statistics for all fitted models.

Figure 2 (next page) is a close-up of the ECDF where the greatest variation is present. It shows how well the four estimated models fit the observed data. It is apparent that the 2-way models fit relatively better for both functions—which appear nearly identical. Figure 3 shows a subset of the observed and expected frequencies for the 2-way models. As expected, the higher observed frequencies are accompanied by estimates with greater variability, as well as being slightly underestimated.

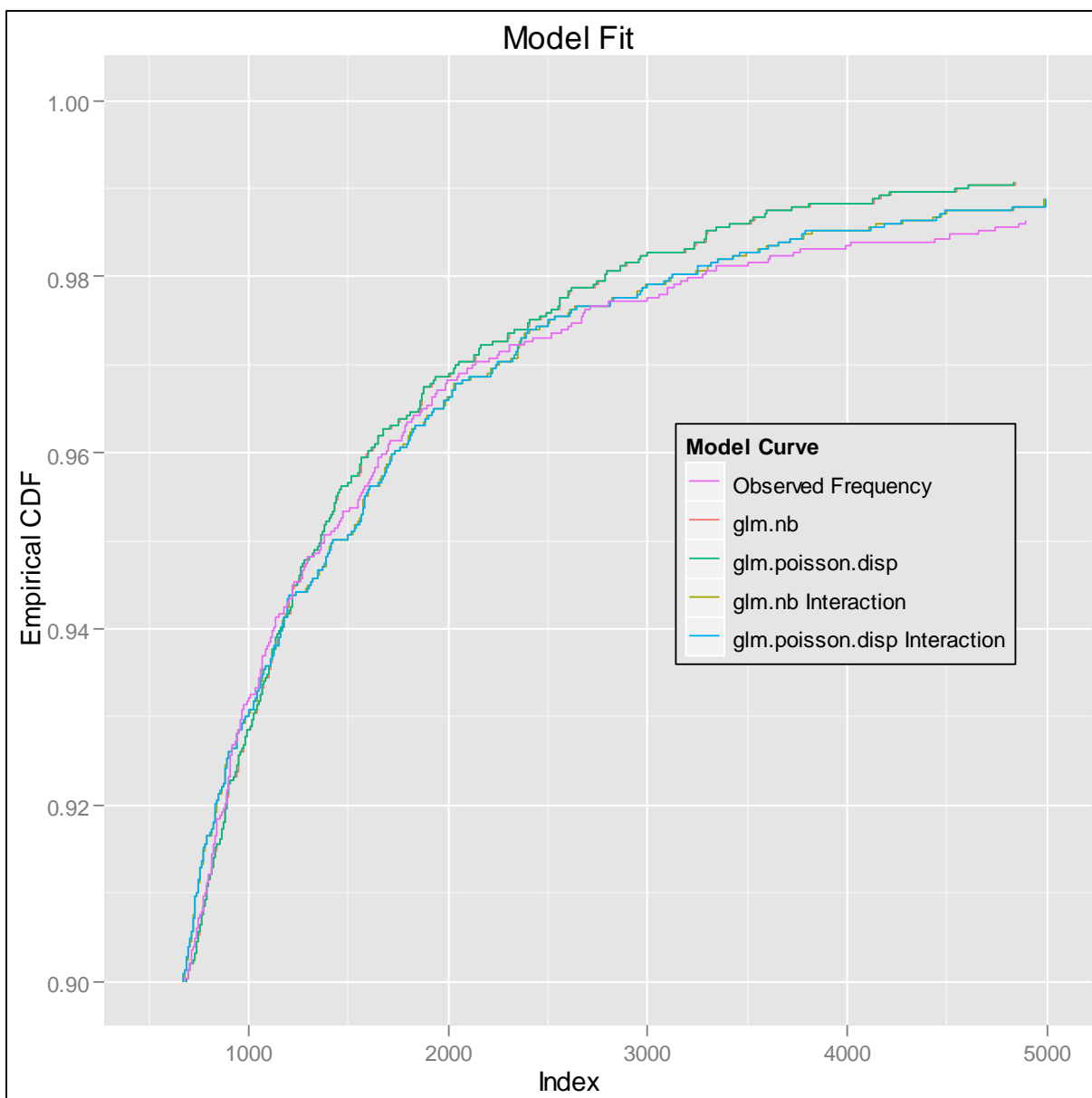


Figure 2. ECDF of all models.

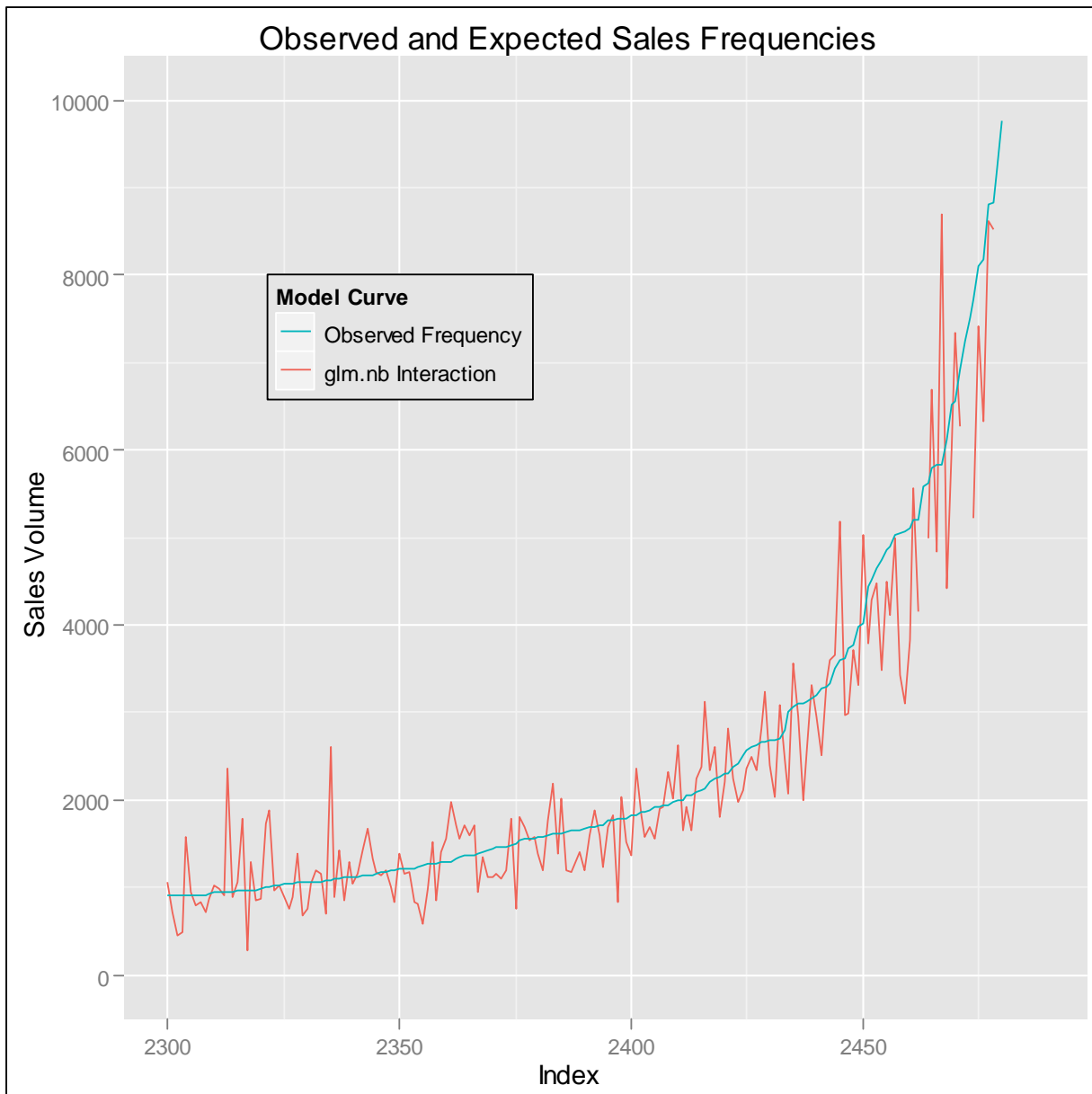


Figure 3. Observed and expected frequencies vs. Sales Volume.

4.3 Model Assumptions

The boxplots of deviance residuals for the covariates show that, for each, no obvious trend is apparent which indicates that the log transform of the baseline count was appropriate (Appendix 1-B.2,3 & 1-C.2,3) (Breslow 1995). Residual vs. Fitted plots given for both functions do not show evidence of non-linearity, or unequal error variances. However, they both show three (different for each function) outliers, but further investigation showed them to have no undue influence on parameter estimates (Appendix 1-B.1 and 1-C.1). Residual vs. Leverage plots did not show any substantial high-leverage points warranting any action, though again, both functions identified different observations as being high-leverage (Appendix 1-B.1 and 1-C.1). Further, DF Beta plots show no issues with highly influential observations (Appendix 1-B.4 and 1-C.4). Also, there is no evidence of over-dispersion, or poor fit seen in the Scale-Location plot for either function and the normal Q-Q plots (Appendix 1-B.1 and 1-C.1) show differing results—that the ML model fits much better than the MM model—but Figure 4 shows that the deviance residuals are approximately normal, again indicating correct model specification and model fit (McCullagh & Nelder 1989, Lawless 1989).

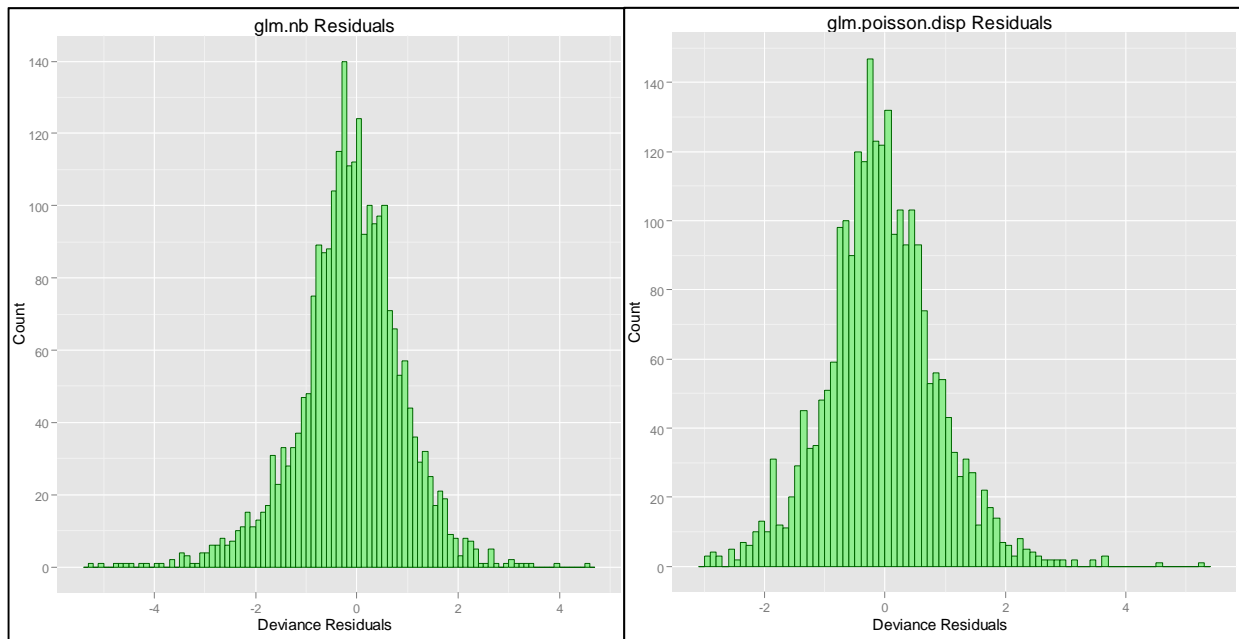


Figure 4. Deviance residuals for both models are approximately normally distributed.

4.4 Differing Model Results

Both models contained parameters that were inestimable because of singularities in the Hessian matrix.

The `glm.nb` failed to estimate nine parameters while `glm.poisson.disp` did not estimate eight (Table 6).

| <code>glm.poisson.disp</code> | <code>glm.nb</code> |
|-------------------------------|----------------------------|
| Bostitch : Not Cordless | Bostitch : Not Cordless |
| Delta : Not Cordless | Delta : Not Cordless |
| Festool : Reconditioned | Festool : Reconditioned |
| Homelite : Not Cordless | Homelite : Not Cordless |
| Jet : Not Cordless | Jet : Not Cordless |
| Jet : Reconditioned | Jet : Reconditioned |
| Powermatic : Not Cordless | Powermatic : Not Cordless |
| Powermatic : Reconditioned | Powermatic : Reconditioned |
| - | Skil : Phone |

Table 6. Inestimable parameters for both models.

One reason this may happen is because a variable(s) has only two levels. In most instances this is the case, however, the singularities are not arising from the same parameters in both models. Since the models are not estimating the same parameters, the effects of the covariates can be quite different between models, i.e., one model may show a strong positive association, while the other, a strong negative. To work around singularities stemming from this it may be possible to collapse levels, or combine variables at the cost of losing information for other covariate combinations that are available. In addition, the singularity may also arise from a mis-specified model. One aspect of the data that this analysis does not address is the effect of time on the covariates, so it may be that the inclusion of this term may aid in allowing for more estimable parameters.

The direction of many parameters differed between the two functions as well. For instance, of the 226 parameters estimated by both functions, `glm.poisson.disp` estimated 92 negative and 134 positive associations, while `glm.nb` estimated 149 negative and 77 positive associations. Also, 42% of parameter estimates are going in opposite directions with varying degrees of magnitude.

5. Results

As shown previously by Figure 4, the univariate standardized deviance residuals for both models have comparable results that are listed next. Five brands that have the most variability are Ridgid, Dewalt, Bostitch, Skil, and Porter Cable. Similarly brands with the least variability are Jet, Homelite, Makita, and Milwaukee. The variability among *Sex* and *Income* is fairly similar across their respective levels, with males and middle income persons showing slightly more variability in observed frequencies. Variability among sales channels is greatest with *agg_channel*, least with *Branded Web*, and about the same across *Phone*, *Amazon*, and *eBay*. *Cordless* and *New* items exhibited greater variability than *Corded* and *Reconditioned* items, respectively.

Given the large number of comparisons that can be made between all of the variable levels, what is to follow first is an outline of how any comparison between two variables using a conditional odds ratio may be made along with the interpretation of the result. Second, this outline is also done for the odds ratio of any single interaction with respect to the reference level. Third, in the case where one or more of the variables in the interaction has only two levels, the odds ratios is a comparison of that group against the reference group. Also note that the above comparisons should only be done if 1 is not in the 95% confidence interval(s) (95%CI), as these do not indicate any significant difference between variable levels.

Comparison between two variables using a conditional odds ratio

- ☞ Divide the odds ratios of any two interactions that have (i) the exact same level of one variable, and (ii) share the type of the other variable.

For instance, using estimates given by `glm.nb`, the association between Black & Decker items being sold on eBay compared to Amazon holding all other variables fixed at the reference level (*male*, *middle-income*, and *new*, *cordless* items) is given by

$$\frac{\text{Black \& Decker : Amazon Sales Odds Ratio}}{\text{Black \& Decker: eBay Sales Odds Ratio}} = \frac{1.439}{.404} = 3.562.$$

This means that any *new* and *cordless* Black & Decker item purchased by a *middle-income male* is about 3.6 times more likely to be sold on Amazon than it is on eBay. Similarly, the odds of a *new* and *cordless* Black & Decker item purchased by a *middle-income male* on Amazon are about 256% higher than the odds it is bought on eBay. To use the estimate given by `glm.poisson.disp`, we get a contradicting

direction and magnitude of association—it is now a decrease for Amazon of about 41% compared to eBay.

Interpreting an odds ratio with respect to the reference group

- ☞ If the odds ratio of any interaction is below 1, then, with respect to the sales frequency, there is evidence of a negative association between these variable levels when compared to the reference group. If the odds ratio is greater than 1, then there is a positive association.
- ☞ Any association for such cases represents the odds of being in the defined group rather than being in the reference group.

This example uses the estimate from `glm.nb`. For instance, given the reference levels of a middle-income male buying a new cordless item, the odds ratio for the interaction between Black & Decker and Phone, 0.55, represents a negative association between these variables and sales volume (frequency) when compared to the sales volume expected from a middle-income male buying a new cordless item from Bosch via the Branded Web site (Bosch and Branded Web are the reference levels for the variables). More simply, this odds ratio is the odds of being in one group rather than another.

This ratio may also be interpreted in the following way: For any middle-income male buying a new cordless Black & Decker item over the phone, there is a decrease in the predicted sales volume by a factor of 0.55, or simply, a 45% decrease when compared to a Bosch item sold via the Branded Web site (for the same any middle-income male buying a new cordless item).

The case where a variable(s) has only two levels

This is a more naturally understood case because the odds ratio represents the odds of being in group rather than the other. This example uses the estimate from `glm.nb`. Consider the interaction between Black & Decker and Reconditioned. For any middle-income male buying a reconditioned cordless Black & Decker item via the branded website, there is a 60% increase in the predicted sales volume when compared to a new item with the other variables held fixed. Another interpretation can be that the odds are 1.6 times higher for a middle-income male buying a reconditioned cordless Black & Decker item via the branded website rather than a new item.

The variables of interest are contained in the interactions listed in Table 2 and are restated here:

| | | |
|-------------------|---------------------|----------------------|
| Brand : Channel | Channel : Income | Cordless : Condition |
| Brand : Income | Channel : Sex | Income : Sex |
| Brand : Sex | Channel : Cordless | Income : Condition |
| Brand : Cordless | Channel : Condition | Sex : Cordless |
| Brand : Condition | | Sex : Condition |

Note again that the interaction between a person's income level and an item being either cordless or not is insignificant. That is, any combination of these two variables does not have an effect on sales volume. Assuming `glm.poisson.disp` is used, Table 7 summarizes interactions having lower than expected sales volumes (interactions where the variables are negatively associated). The interaction between *Brand* and *Channel* is not described because the frequency with which each combination appears is visually and contextually convoluted.

| | | | | | | | |
|--------------------------------------|-------------------|-------------------|-----------|------------|--------------|----------|------|
| Sex (female and/or unknown) : | | | | | | | |
| Brand | Bostitch | Campbell Hausfeld | Delta | Dewalt | Festool | Homelite | Jet |
| | Metabo | Milwaukee | Panasonic | Powermatic | Porter Cable | Ridgid | Skil |
| Channel | agg_channel | Phone | | | | | |
| Condition | Reconditioned | | | | | | |
| Cordless | Not Cordless | | | | | | |
| Income | High | | | | | | |
| Not Cordless : | | | | | | | |
| Brand | Black & Decker | Dewalt | Makita | Milwaukee | | | |
| | Panasonic | Porter Cable | Ridgid | | | | |
| Channel | agg_channel | eBay | | | | | |
| Condition | Reconditioned | | | | | | |
| Sex | Female | Unknown | | | | | |
| Reconditioned: | | | | | | | |
| Brand | Campbell Hausfeld | Delta | Dewalt | Fein | | | |
| | Metabo | Milwaukee | Panasonic | | | | |
| Channel | Phone | | | | | | |
| Cordless | Not Cordless | | | | | | |
| Income | Low | | | | | | |
| Sex | Unknown | | | | | | |
| Income (low and/or high) : | | | | | | | |
| Brand | Black & Decker | Campbell Hausfeld | Homelite | Karcher | Fein | Festool | |
| | Milwaukee | Panasonic | Ridgid | Ryobi | | | |
| Channel | agg_channel | Amazon | | | | | |
| Condition | Reconditioned | | | | | | |

Table 7. Interactions showing negative associations

6. Discussion

Though the negative binomial model is more efficient and fully-defined compared to the moment method, allowing for likelihood ratio tests, moment methods are more robust to issues of extra-dispersion (Lawless 1987). Which is *better* may lie in one of the main areas yet to be assessed—an investigation into independence between clusters of data and their correlations. Because temporal and spatial considerations are not addressed through the inclusion of variables like time-of-sale, unique customer identification, or geographical location, it is not clear that all variation is accounted for, or what effect their inclusion may have on the results. Also, if singularities still occur after the inclusion of such covariates, then running models repeatedly with and without each variable may be necessary to determine where they are coming from. However, if these covariates are included, then, for example, prospective analyses, or profile analysis may be utilized.

In addition, further investigation may show that when `glm.poisson.disp` and `glm.nb` estimate the same model their results are indistinguishable from one another. It should also be noted that a *quasi-Poisson* model was estimated, and when the ECFs were compared, it appeared to fit better. Venables and Ripley (2002) suggest the use of *quasi-* models. The only justification for choosing `glm.poisson.disp` over `glm.nb` is that it estimated one additional parameter. However, since `glm.poisson.disp` and `glm.nb` are quite different with respect to parameter estimates, it is recommended that a third function using a *quasi*-likelihood method be tested so that some sort of validation of either the MM or ML model can be made. As mentioned before, the visual fit of the *quasi-* method fit better, so it will likely be the case that this method will be best, given the variables used.

7. Conclusion

Both `glm.nb` and `glm.poisson.disp` identified similar variables to estimate using stepwise selection methods, but showed differences in the inestimable parameters in each model. Estimates of dispersion parameters, and dissimilarity index (DI) values were relatively close to one another; $\hat{\phi}_{NB} = 0.161$ and $\hat{\phi}_{Poi} = 0.188$ (Table 3), and shown by the DI values of 0.38 and 0.35 (Table 4), respectively. As evidenced by the ECDF plot (Figure 2), model fit for the two functions is nearly identical. The notable difference stems from the effect the unstable parameters due to singularities has on the measures of associations: `glm.poisson.disp` estimated 92 negative and 134 positive associations, while `glm.nb` estimated 149 negative and 77 positive associations. That is, 42% of parameter estimates are going in opposite directions with varying degrees of magnitude.

References

- Agresti, Alan (2007). *Introduction to Categorical Data Analysis*. Second Edition. Wiley & Sons, New Jersey.
- Aragan, J., D. Eberly and S. Eberly (1992). *Existence and Uniqueness of the Maximum Likelihood Estimator for the Two-parameter Negative Binomial Distribution*. Statist. Probabil. Lett., **15**, 375-379.
- Breslow, N.E.(1984). *Extra-Poisson Variation in Log-linear Models*. Appl. Statist. **33** No.1, 38-44.
- Breslow, N.E.(1995). *Generalized Linear Models: Checking Assumptions and Strengthening Conclusions*. Prepared for the Congresso Nazionale Societa' Italiana di Biometrica. 16-17 June, 1995.
- Lawless, J.F. (1987) Negative binomial and mixed Poisson regression. *Canadian Journal of Statistics* **15**, 209-225.
- McCullagh, P.,and Nelder,J .A. (1989). *Generalized Linear Models*. Second Edition. Chapman and Hall, London.
- Venables, W.N. and Ripley, B.D. (2002) *Modern Applied Statistics with S*. Fourth Edition. Springer-Verlag, New York.

Web References

- Hinde, John and Demétrio, Clarice G.B. Overdispersion: Models and Estimation. Lecture. Web 12 April, 2007. Accessed 5 June, 2012. <<http://www.lce.esalq.usp.br/arquivos/aulas/2011/LCE5868/OverdispersionBook.pdf>>.
- IBM. Unexpected singularities in the Hessian matrix in NOMREG (Multinomial Logistic Regression). Reference #: 1480408. Modified date: 2011-03-22. Web. 1 Aug. 2012. <<http://www-01.ibm.com/support/docview.wss?uid=swg21480408>>.
- Ismail , Norizura and Jemain, Abdyl Aziz. Handling Overdispersion with Negative Binomial and Generalized Poisson Regression. Submitted Paper. Web 31 Jan. 2007. <<http://www.casact.org/pubs/forum/07wforum/07w109.pdf>>.
- Jansakul, Naratip and Hinde, John P. Linear Mean-Variance Negative Binomial Models Applied to a Set of Orange Tissue-Culture Data. Submitted Paper. Web 2002. Accessed. 7 July, 2012. <<http://iceb.nccu.edu.tw/proceedings/APDSI/2002/papers/paper223.pdf>>.
- Kuha, Jouni and Firth, David (2010). On the Index of Dissimilarity for Lack Of Fit in Loglinear and Log-multiplicative Models. *Computational Statistics and Data Analysis* **55**, 375-388. Web. 1 Sept. 2011. Accessed 6 May, 2012. <http://ac.els-cdn.com/S0167947310001921/1-s2.0-S0167947310001921-main.pdf?_tid=5dfa0ca2-fdf9-11e1-b376-00000aacb35d&acdnat=1347578506_63e1f64a2ca8230133275f27be9f4817>.
- Ma, Dan. The Negative Binomial Distribution. *A Blog on Probability and Statistics*. 11 July, 2011. Accessed 13 Aug. 2012. <<http://probabilityandstats.wordpress.com/tag/poisson-gamma-mixture/>>.

Appendix 1-A Model Comparisons: Odds Ratios (95% CI)

Table 8. Model comparisons.

| <p>1) glm.poisson.disp: 92 covariates have negative association; 134 have positive association. glm.nb: 149 covariates have negative association; 77 have positive association. Associations estimated in different directions are in bold.</p> <p>2) 95% confidence intervals that include 1 are not significant at the $\alpha = 0.05$ level.</p> <p>3) Between glm.nb and glm.poisson.disp, 42% (95 of 226) of parameter estimates given by both models are in opposing directions. For glm.poisson.disp there were 92 covariates showing negative associations and 134 showing positive associations. For glm.nb there were 149 covariates showing negative associations and 77 showing positive associations.</p> <p>4) Estimates are rounded to the 2nd and 3rd decimal where appropriate to show that a 0 is not returned.</p> <p>5) Parameters estimated by both models.</p> | | | | |
|--|-------------------------------|---------------------|---|-------------------------------|
| Parameters | glm.poisson.disp coef (se) | glm.nb coef (se) | glm.poisson.disp Odds Ratio (95% CI) | glm.nb Odds Ratio (95% CI) |
| (Intercept) | 7.07 (0.11) | 4.43 (0.11) | | |
| agg_channel : Female | -0.55 (0.08) | -0.56 (0.08) | 0.58 (0.46, 0.71) | 0.573 (0.491, 0.67) |
| agg_channel : High Income | -0.06 (0.06) | -0.05 (0.06) | 0.95 (0.81, 1.11) | 0.948 (0.846, 1.06) |
| agg_channel : Low Income | 0.09 (0.06) | 0.09 (0.05) | 1.1 (0.95, 1.27) | 1.096 (0.987, 1.22) |
| agg_channel : Not Cordless | -0.62 (0.08) | -0.62 (0.07) | 0.54 (0.44, 0.66) | 0.54 (0.468, 0.62) |
| agg_channel : Reconditioned | 1.41 (0.07) | 1.41 (0.07) | 4.1 (3.41, 4.93) | 4.099 (3.593, 4.68) |
| agg_channel : Sex Not Known | 0.02 (0.08) | 0.02 (0.08) | 1.03 (0.83, 1.26) | 1.022 (0.881, 1.19) |
| Amazon Sales : Female | 0.56 (0.07) | 0.56 (0.06) | 1.75 (1.47, 2.10) | 1.754 (1.545, 1.99) |
| Amazon Sales : High Income | -0.19 (0.05) | -0.19 (0.05) | 0.82 (0.72, 0.94) | 0.823 (0.75, 0.9) |
| Amazon Sales : Low Income | -0.02 (0.05) | -0.02 (0.05) | 0.98 (0.87, 1.12) | 0.983 (0.898, 1.08) |
| Amazon Sales : Not Cordless | -0.07 (0.07) | -0.06 (0.06) | 0.94 (0.79, 1.11) | 0.941 (0.834, 1.06) |
| Amazon Sales : Reconditioned | 0.94 (0.06) | 0.95 (0.06) | 2.56 (2.19, 2.99) | 2.575 (2.304, 2.88) |
| Amazon Sales : Sex Not Known | 0.51 (0.07) | 0.51 (0.07) | 1.67 (1.39, 1.99) | 1.664 (1.465, 1.89) |
| Black & Decker : agg_channel | 0.65 (0.17) | -1.49 (0.18) | 1.92 (1.24, 2.97) | 0.226 (0.16, 0.32) |
| Black & Decker : Amazon Sales | 1.31 (0.15) | 0.36 (0.15) | 3.7 (2.53, 5.41) | 1.439 (1.074, 1.93) |
| Black & Decker : eBay Sales | 1.84 (0.15) | -0.91 (0.15) | 6.31 (4.24, 9.37) | 0.404 (0.299, 0.55) |
| Black & Decker : Female | 0.99 (0.12) | -0.73 (0.1) | 2.69 (1.97, 3.68) | 0.484 (0.4, 0.59) |
| Black & Decker : High Income | -0.09 (0.09) | 0.65 (0.07) | 0.91 (0.73, 1.15) | 1.912 (1.657, 2.21) |
| Black & Decker : Low Income | 0.05 (0.09) | -1.62 (0.07) | 1.06 (0.85, 1.32) | 0.198 (0.173, 0.23) |
| Black & Decker : Not Cordless | -1.38 (0.1) | 0.67 (0.09) | 0.25 (0.19, 0.32) | 1.945 (1.642, 2.3) |
| Black & Decker : Phone | -0.6 (0.15) | -0.8 (0.14) | 0.55 (0.37, 0.82) | 0.45 (0.341, 0.59) |
| Black & Decker : Reconditioned | 0.34 (0.1) | 0.47 (0.08) | 1.4 (1.08, 1.82) | 1.602 (1.357, 1.89) |
| Black & Decker : Sex Not Known | 0.2 (0.12) | -1.76 (0.1) | 1.22 (0.89, 1.67) | 0.173 (0.142, 0.21) |
| Bostitch : agg_channel | 0.43 (0.2) | -0.19 (0.2) | 1.54 (0.92, 2.57) | 0.825 (0.562, 1.21) |
| Bostitch : Amazon Sales | 0.18 (0.18) | 0.75 (0.18) | 1.19 (0.74, 1.91) | 2.125 (1.495, 3.02) |
| Bostitch : eBay Sales | 0.54 (0.19) | -0.69 (0.19) | 1.71 (1.04, 2.81) | 0.5 (0.346, 0.72) |
| Bostitch : Female | 0.24 (0.15) | -1.48 (0.13) | 1.26 (0.86, 1.86) | 0.227 (0.175, 0.29) |
| Bostitch : High Income | 0.13 (0.11) | 0.87 (0.09) | 1.14 (0.86, 1.50) | 2.386 (1.993, 2.86) |
| Bostitch : Low Income | 0.08 (0.1) | -1.59 (0.09) | 1.08 (0.83, 1.41) | 0.204 (0.172, 0.24) |

| Table 7 Model comparisons (cont.) | glm.poisson.disp | glm.nb | glm.poisson.disp | glm.nb |
|--|---------------------|---------------------|--------------------------|----------------------------|
| Parameters | coef (se) | coef (se) | Odds Ratio (95% CI) | Odds Ratio (95% CI) |
| Bostitch : Phone | -0.1 (0.19) | 1.22 (0.17) | 0.91 (0.56, 1.46) | 3.374 (2.432, 4.68) |
| Bostitch : Reconditioned | 0.93 (0.12) | 1.07 (0.11) | 2.55 (1.85, 3.50) | 2.915 (2.343, 3.63) |
| Bostitch : Sex Not Known | -0.01 (0.15) | -1.96 (0.13) | 0.99 (0.68, 1.46) | 0.141 (0.109, 0.18) |
| Campbell Hausfeld : agg_channel | 0.12 (0.19) | -3.84 (0.21) | 1.12 (0.68, 1.85) | 0.022 (0.014, 0.03) |
| Campbell Hausfeld : Amazon Sales | 0.13 (0.16) | -2.62 (0.17) | 1.14 (0.75, 1.74) | 0.073 (0.052, 0.1) |
| Campbell Hausfeld : eBay Sales | 0.8 (0.17) | -3.75 (0.19) | 2.23 (1.43, 3.48) | 0.024 (0.016, 0.03) |
| Campbell Hausfeld : Female | 0.39 (0.13) | -1.33 (0.11) | 1.48 (1.05, 2.09) | 0.266 (0.212, 0.33) |
| Campbell Hausfeld : High Income | -0.02 (0.1) | 0.72 (0.08) | 0.98 (0.76, 1.27) | 2.06 (1.749, 2.43) |
| Campbell Hausfeld : Low Income | 0.15 (0.1) | -1.52 (0.08) | 1.16 (0.91, 1.49) | 0.218 (0.187, 0.25) |
| Campbell Hausfeld : Not Cordless | 1.57 (0.13) | 3.62 (0.11) | 4.78 (3.44, 6.66) | 37.195 (29.984, 46.14) |
| Campbell Hausfeld : Phone | -0.37 (0.16) | -2.38 (0.16) | 0.69 (0.45, 1.06) | 0.092 (0.067, 0.13) |
| Campbell Hausfeld : Reconditioned | -0.3 (0.11) | -0.16 (0.1) | 0.74 (0.56, 0.99) | 0.856 (0.708, 1.04) |
| Campbell Hausfeld : Sex Not Known | 0 (0.14) | -1.96 (0.12) | 1 (0.70, 1.42) | 0.141 (0.112, 0.18) |
| Delta : agg_channel | -0.53 (0.24) | -0.61 (0.22) | 0.59 (0.32, 1.10) | 0.543 (0.351, 0.84) |
| Delta : Amazon Sales | -0.14 (0.19) | 0.99 (0.19) | 0.87 (0.53, 1.42) | 2.7 (1.863, 3.91) |
| Delta : eBay Sales | -1.98 (0.31) | -2.69 (0.29) | 0.14 (0.06, 0.31) | 0.068 (0.038, 0.12) |
| Delta : Female | -0.18 (0.17) | -1.91 (0.15) | 0.83 (0.53, 1.30) | 0.149 (0.11, 0.2) |
| Delta : High Income | 0.08 (0.13) | 0.83 (0.11) | 1.08 (0.78, 1.50) | 2.282 (1.841, 2.83) |
| Delta : Low Income | 0.14 (0.12) | -1.54 (0.1) | 1.15 (0.84, 1.56) | 0.215 (0.175, 0.26) |
| Delta : Phone | 0.32 (0.19) | 2.19 (0.18) | 1.38 (0.83, 2.27) | 8.919 (6.31, 12.61) |
| Delta : Reconditioned | -2.03 (0.14) | -1.89 (0.13) | 0.13 (0.09, 0.19) | 0.151 (0.117, 0.2) |
| Delta : Sex Not Known | -0.21 (0.17) | -2.17 (0.15) | 0.81 (0.52, 1.26) | 0.114 (0.085, 0.15) |
| Dewalt : agg_channel | 0.78 (0.16) | -0.28 (0.15) | 2.18 (1.45, 3.27) | 0.752 (0.555, 1.02) |
| Dewalt : Amazon Sales | -0.43 (0.15) | -0.29 (0.15) | 0.65 (0.44, 0.96) | 0.751 (0.558, 1.01) |
| Dewalt : eBay Sales | 0.31 (0.16) | -1.36 (0.16) | 1.37 (0.90, 2.08) | 0.258 (0.188, 0.35) |
| Dewalt : Female | 0.13 (0.12) | -1.59 (0.1) | 1.14 (0.83, 1.56) | 0.205 (0.169, 0.25) |
| Dewalt : High Income | 0.28 (0.09) | 1.02 (0.07) | 1.33 (1.05, 1.680) | 2.777 (2.402, 3.21) |
| Dewalt : Low Income | 0.08 (0.09) | -1.6 (0.07) | 1.08 (0.87, 1.34) | 0.203 (0.177, 0.23) |
| Dewalt : Not Cordless | -1.01 (0.1) | 1.04 (0.09) | 0.37 (0.28, 0.47) | 2.833 (2.396, 3.35) |
| Dewalt : Phone | -0.53 (0.15) | 0.35 (0.14) | 0.59 (0.40, 0.87) | 1.42 (1.08, 1.87) |
| Dewalt : Reconditioned | -0.63 (0.1) | -0.49 (0.08) | 0.53 (0.41, 0.69) | 0.615 (0.522, 0.73) |
| Dewalt : Sex Not Known | -0.09 (0.12) | -2.04 (0.1) | 0.92 (0.67, 1.25) | 0.13 (0.107, 0.16) |
| eBay Sales : Female | 0.2 (0.08) | 0.19 (0.07) | 1.22 (1.00, 1.48) | 1.214 (1.058, 1.39) |
| eBay Sales : High Income | 0.39 (0.06) | 0.4 (0.05) | 1.48 (1.28, 1.72) | 1.486 (1.338, 1.65) |
| eBay Sales : Low Income | 0.13 (0.05) | 0.13 (0.05) | 1.14 (1.00, 1.31) | 1.138 (1.034, 1.25) |
| eBay Sales : Not Cordless | -0.03 (0.07) | -0.02 (0.07) | 0.97 (0.81, 1.17) | 0.978 (0.858, 1.12) |
| eBay Sales : Reconditioned | 1.54 (0.07) | 1.55 (0.06) | 4.68 (3.95, 5.55) | 4.702 (4.166, 5.31) |
| eBay Sales : Sex Not Known | 0.44 (0.08) | 0.43 (0.07) | 1.55 (1.28, 1.88) | 1.544 (1.345, 1.77) |
| Fein : agg_channel | -0.18 (0.25) | -5.98 (0.32) | 0.84 (0.43, 1.60) | 0.003 (0.001, 0) |
| Fein : Amazon Sales | 0.29 (0.22) | -4.29 (0.28) | 1.33 (0.76, 2.34) | 0.014 (0.008, 0.02) |
| Fein : eBay Sales | 1.46 (0.2) | -4.92 (0.28) | 4.31 (2.57, 7.26) | 0.007 (0.004, 0.01) |

| Table 7 Model comparisons (cont.) | glm.poisson.disp | glm.nb | glm.poisson.disp | glm.nb |
|-----------------------------------|---------------------|---------------------|---------------------------|----------------------------|
| Parameters | coef (se) | coef (se) | Odds Ratio (95% CI) | Odds Ratio (95% CI) |
| Fein : Female | 0.37 (0.17) | -1.35 (0.15) | 1.45 (0.94, 2.23) | 0.258 (0.193, 0.35) |
| Fein : High Income | -0.15 (0.13) | 0.6 (0.11) | 0.86 (0.62, 1.19) | 1.816 (1.468, 2.25) |
| Fein : Low Income | -0.03 (0.12) | -1.7 (0.1) | 0.97 (0.71, 1.32) | 0.182 (0.148, 0.22) |
| Fein : Not Cordless | 2.64 (0.24) | 4.72 (0.23) | 14.02 (7.47, 26.31) | 112.561 (72.367, 175.08) |
| Fein : Phone | -0.31 (0.2) | -4.16 (0.26) | 0.73 (0.44, 1.22) | 0.016 (0.009, 0.03) |
| Fein : Reconditioned | -1.97 (0.16) | -1.84 (0.14) | 0.14 (0.09, 0.21) | 0.159 (0.12, 0.21) |
| Fein : Sex Not Known | 0.01 (0.17) | -1.96 (0.15) | 1.01 (0.65, 1.56) | 0.141 (0.105, 0.19) |
| Female : Not Cordless | -0.15 (0.05) | -0.15 (0.05) | 0.86 (0.75, 0.99) | 0.862 (0.779, 0.95) |
| Female : Reconditioned | -0.49 (0.05) | -0.49 (0.05) | 0.61 (0.54, 0.70) | 0.613 (0.558, 0.67) |
| Festool : agg_channel | -0.13 (0.33) | -4.86 (0.35) | 0.88 (0.37, 2.08) | 0.008 (0.004, 0.02) |
| Festool : Amazon Sales | -0.26 (0.22) | -3.8 (0.25) | 0.77 (0.44, 1.37) | 0.022 (0.014, 0.04) |
| Festool : eBay Sales | -1.39 (0.36) | -6.74 (0.37) | 0.25 (0.10, 0.62) | 0.001 (0.001, 0) |
| Festool : Female | -0.31 (0.21) | -2.03 (0.18) | 0.73 (0.43, 1.25) | 0.131 (0.092, 0.19) |
| Festool : High Income | -0.32 (0.15) | 0.43 (0.13) | 0.73 (0.50, 1.07) | 1.538 (1.191, 1.99) |
| Festool : Low Income | -0.04 (0.15) | -1.71 (0.13) | 0.96 (0.65, 1.43) | 0.181 (0.139, 0.24) |
| Festool : Not Cordless | 1.81 (0.21) | 3.89 (0.19) | 6.14 (3.57, 10.55) | 48.797 (33.618, 70.83) |
| Festool : Phone | 0.05 (0.22) | -2.75 (0.24) | 1.05 (0.59, 1.87) | 0.064 (0.04, 0.1) |
| Festool : Sex Not Known | 0.1 (0.2) | -1.86 (0.18) | 1.11 (0.66, 1.86) | 0.155 (0.11, 0.22) |
| High Income : Female | 0.21 (0.04) | 0.21 (0.04) | 1.23 (1.10, 1.38) | 1.231 (1.136, 1.33) |
| High Income : Reconditioned | 0.12 (0.04) | 0.12 (0.04) | 1.13 (1.02, 1.24) | 1.129 (1.053, 1.21) |
| High Income : Sex Not Known | -0.04 (0.04) | -0.04 (0.04) | 0.96 (0.86, 1.07) | 0.96 (0.887, 1.04) |
| Homelite : agg_channel | 1.23 (0.25) | -5.8 (0.51) | 3.43 (1.82, 6.47) | 0.003 (0.001, 0.01) |
| Homelite : Amazon Sales | 0.36 (0.24) | -5.47 (0.51) | 1.43 (0.77, 2.63) | 0.004 (0.002, 0.01) |
| Homelite : eBay Sales | 1.99 (0.24) | -5.64 (0.51) | 7.32 (3.95, 13.59) | 0.004 (0.001, 0.01) |
| Homelite : Female | 0.33 (0.19) | -1.38 (0.17) | 1.39 (0.86, 2.26) | 0.251 (0.179, 0.35) |
| Homelite : High Income | 0.03 (0.13) | 0.77 (0.12) | 1.03 (0.73, 1.46) | 2.165 (1.706, 2.75) |
| Homelite : Low Income | 0.13 (0.13) | -1.55 (0.12) | 1.14 (0.81, 1.59) | 0.213 (0.169, 0.27) |
| Homelite : Phone | -0.41 (0.25) | -5.5 (0.5) | 0.66 (0.35, 1.25) | 0.004 (0.002, 0.01) |
| Homelite : Reconditioned | 6.7 (0.5) | 6.84 (0.47) | 810.22 (225.89, 2906.08) | 933.375 (369.889, 2355.27) |
| Homelite : Sex Not Known | -0.05 (0.19) | -2.01 (0.17) | 0.95 (0.59, 1.54) | 0.134 (0.096, 0.19) |
| Jet : agg_channel | -0.6 (0.33) | -1.22 (0.28) | 0.55 (0.24, 1.27) | 0.295 (0.17, 0.51) |
| Jet : Amazon Sales | 0.78 (0.24) | 1.37 (0.21) | 2.17 (1.17, 4.03) | 3.951 (2.617, 5.96) |
| Jet : eBay Sales | 1.78 (0.25) | 0.57 (0.22) | 5.94 (3.14, 11.25) | 1.776 (1.162, 2.72) |
| Jet : Female | -0.37 (0.2) | -2.09 (0.18) | 0.69 (0.41, 1.16) | 0.123 (0.087, 0.18) |
| Jet : High Income | 0.27 (0.15) | 1.01 (0.13) | 1.31 (0.90, 1.91) | 2.742 (2.135, 3.52) |
| Jet : Low Income | 0.1 (0.14) | -1.57 (0.12) | 1.1 (0.77, 1.58) | 0.207 (0.163, 0.26) |
| Jet : Phone | 0.42 (0.24) | 1.75 (0.2) | 1.52 (0.82, 2.82) | 5.775 (3.887, 8.58) |
| Jet : Sex Not Known | -0.14 (0.2) | -2.09 (0.18) | 0.87 (0.52, 1.45) | 0.123 (0.087, 0.17) |
| Karcher : agg_channel | 0.83 (0.2) | -4.75 (0.36) | 2.3 (1.38, 3.82) | 0.009 (0.004, 0.02) |
| Karcher : Amazon Sales | 0.56 (0.18) | -3.82 (0.35) | 1.75 (1.09, 2.81) | 0.022 (0.011, 0.04) |
| Karcher : eBay Sales | 1.02 (0.19) | -5.17 (0.37) | 2.76 (1.69, 4.51) | 0.006 (0.003, 0.01) |

| Table 7 Model comparisons (cont.) | glm.poisson.disp | glm.nb | glm.poisson.disp | glm.nb |
|-----------------------------------|---------------------|---------------------|--------------------------|----------------------------|
| Parameters | coef (se) | coef (se) | Odds Ratio (95% CI) | Odds Ratio (95% CI) |
| Karcher : Female | 0.46 (0.15) | -1.27 (0.13) | 1.58 (1.08, 2.30) | 0.282 (0.219, 0.36) |
| Karcher : High Income | -0.37 (0.11) | 0.37 (0.09) | 0.69 (0.53, 0.91) | 1.453 (1.217, 1.73) |
| Karcher : Low Income | -0.11 (0.1) | -1.78 (0.09) | 0.9 (0.69, 1.17) | 0.168 (0.141, 0.2) |
| Karcher : Not Cordless | 2.74 (0.36) | 4.82 (0.34) | 15.45 (6.17, 38.72) | 124.025 (63.16, 243.54) |
| Karcher : Phone | -0.36 (0.19) | -4 (0.37) | 0.7 (0.43, 1.13) | 0.018 (0.009, 0.04) |
| Karcher : Reconditioned | 0.43 (0.12) | 0.57 (0.11) | 1.54 (1.12, 2.12) | 1.775 (1.427, 2.21) |
| Karcher : Sex Not Known | 0.06 (0.15) | -1.9 (0.13) | 1.06 (0.72, 1.56) | 0.149 (0.115, 0.19) |
| Low Income : Female | 0.17 (0.04) | 0.17 (0.04) | 1.19 (1.07, 1.32) | 1.184 (1.099, 1.28) |
| Low Income : Reconditioned | -0.02 (0.04) | -0.02 (0.03) | 0.98 (0.90, 1.08) | 0.985 (0.922, 1.05) |
| Low Income : Sex Not Known | 0.08 (0.04) | 0.07 (0.04) | 1.08 (0.97, 1.20) | 1.077 (0.999, 1.16) |
| Makita : agg_channel | -0.83 (0.17) | -2.01 (0.17) | 0.44 (0.28, 0.67) | 0.134 (0.097, 0.19) |
| Makita : Amazon Sales | -0.37 (0.15) | -0.35 (0.15) | 0.69 (0.47, 1.01) | 0.706 (0.526, 0.95) |
| Makita : eBay Sales | 0.34 (0.16) | -1.45 (0.16) | 1.4 (0.94, 2.09) | 0.234 (0.172, 0.32) |
| Makita : Female | 0.16 (0.12) | -1.55 (0.1) | 1.18 (0.86, 1.61) | 0.212 (0.175, 0.26) |
| Makita : High Income | 0.08 (0.09) | 0.82 (0.07) | 1.08 (0.86, 1.36) | 2.274 (1.974, 2.62) |
| Makita : Low Income | 0.07 (0.09) | -1.61 (0.07) | 1.07 (0.86, 1.33) | 0.201 (0.175, 0.23) |
| Makita : Not Cordless | -0.53 (0.1) | 1.52 (0.08) | 0.59 (0.46, 0.76) | 4.586 (3.883, 5.42) |
| Makita : Phone | -0.06 (0.15) | 0.7 (0.14) | 0.94 (0.64, 1.38) | 2.011 (1.536, 2.63) |
| Makita : Reconditioned | 0.21 (0.1) | 0.35 (0.08) | 1.24 (0.96, 1.60) | 1.425 (1.211, 1.68) |
| Makita : Sex Not Known | 0.09 (0.12) | -1.86 (0.1) | 1.1 (0.81, 1.50) | 0.156 (0.129, 0.19) |
| Metabo : agg_channel | -0.29 (0.28) | -5.37 (0.31) | 0.75 (0.36, 1.53) | 0.005 (0.003, 0.01) |
| Metabo : Amazon Sales | -0.12 (0.2) | -3.99 (0.24) | 0.89 (0.53, 1.49) | 0.019 (0.012, 0.03) |
| Metabo : eBay Sales | 0.91 (0.22) | -4.77 (0.26) | 2.49 (1.43, 4.34) | 0.008 (0.005, 0.01) |
| Metabo : Female | -0.03 (0.17) | -1.75 (0.15) | 0.97 (0.62, 1.52) | 0.173 (0.128, 0.23) |
| Metabo : High Income | 0.09 (0.13) | 0.84 (0.11) | 1.09 (0.78, 1.52) | 2.316 (1.861, 2.88) |
| Metabo : Low Income | 0.27 (0.12) | -1.4 (0.1) | 1.31 (0.96, 1.80) | 0.246 (0.201, 0.3) |
| Metabo : Not Cordless | 1.73 (0.2) | 3.79 (0.18) | 5.62 (3.33, 9.49) | 44.398 (30.925, 63.74) |
| Metabo : Phone | 0.44 (0.19) | -2.7 (0.22) | 1.55 (0.95, 2.53) | 0.068 (0.044, 0.1) |
| Metabo : Reconditioned | -2.02 (0.15) | -1.88 (0.14) | 0.13 (0.09, 0.20) | 0.153 (0.116, 0.2) |
| Metabo : Sex Not Known | 0.18 (0.17) | -1.78 (0.15) | 1.19 (0.78, 1.83) | 0.168 (0.126, 0.22) |
| Milwaukee : agg_channel | -0.39 (0.16) | -0.75 (0.16) | 0.68 (0.45, 1.02) | 0.473 (0.347, 0.64) |
| Milwaukee : Amazon Sales | 0.01 (0.15) | 0.86 (0.15) | 1.01 (0.69, 1.48) | 2.372 (1.774, 3.17) |
| Milwaukee : eBay Sales | 0.8 (0.15) | -0.15 (0.15) | 2.23 (1.51, 3.32) | 0.862 (0.64, 1.16) |
| Milwaukee : Female | -0.07 (0.12) | -1.78 (0.1) | 0.93 (0.69, 1.27) | 0.168 (0.139, 0.2) |
| Milwaukee : High Income | 0.26 (0.09) | 1 (0.07) | 1.3 (1.04, 1.62) | 2.719 (2.367, 3.12) |
| Milwaukee : Low Income | 0.05 (0.08) | -1.62 (0.07) | 1.05 (0.85, 1.30) | 0.197 (0.173, 0.23) |
| Milwaukee : Not Cordless | -1.23 (0.1) | 0.82 (0.08) | 0.29 (0.23, 0.38) | 2.263 (1.921, 2.67) |
| Milwaukee : Phone | -0.18 (0.15) | 1.41 (0.14) | 0.83 (0.57, 1.22) | 4.087 (3.129, 5.34) |
| Milwaukee : Reconditioned | -0.21 (0.1) | -0.07 (0.08) | 0.81 (0.63, 1.04) | 0.931 (0.794, 1.09) |
| Milwaukee : Sex Not Known | -0.18 (0.12) | -2.13 (0.1) | 0.84 (0.62, 1.14) | 0.119 (0.099, 0.14) |
| Not Cordless : Reconditioned | -0.47 (0.05) | -0.47 (0.05) | 0.63 (0.55, 0.71) | 0.623 (0.57, 0.68) |

| Table 7 Model comparisons (cont.) | glm.poisson.disp | glm.nb | glm.poisson.disp | glm.nb |
|------------------------------------|---------------------|---------------------|---------------------------|----------------------------|
| Parameters | coef (se) | coef (se) | Odds Ratio (95% CI) | Odds Ratio (95% CI) |
| Panasonic : agg_channel | 0.56 (0.26) | -3.11 (0.25) | 1.76 (0.89, 3.46) | 0.045 (0.027, 0.07) |
| Panasonic : Amazon Sales | 1.08 (0.18) | -1.36 (0.18) | 2.95 (1.86, 4.68) | 0.256 (0.181, 0.36) |
| Panasonic : eBay Sales | 1.25 (0.22) | -3.01 (0.21) | 3.48 (1.96, 6.21) | 0.049 (0.032, 0.07) |
| Panasonic : Female | -0.06 (0.17) | -1.78 (0.15) | 0.95 (0.60, 1.48) | 0.169 (0.125, 0.23) |
| Panasonic : High Income | -0.02 (0.13) | 0.72 (0.12) | 0.98 (0.69, 1.38) | 2.059 (1.635, 2.59) |
| Panasonic : Low Income | 0.14 (0.12) | -1.54 (0.11) | 1.15 (0.83, 1.58) | 0.214 (0.173, 0.27) |
| Panasonic : Not Cordless | -2.35 (0.14) | -0.31 (0.12) | 0.1 (0.07, 0.14) | 0.734 (0.58, 0.93) |
| Panasonic : Phone | 0.03 (0.2) | -1.69 (0.18) | 1.03 (0.61, 1.74) | 0.185 (0.13, 0.26) |
| Panasonic : Reconditioned | -1.31 (0.14) | -1.17 (0.12) | 0.27 (0.19, 0.39) | 0.309 (0.244, 0.39) |
| Panasonic : Sex Not Known | 0.27 (0.17) | -1.7 (0.14) | 1.31 (0.85, 2.01) | 0.184 (0.138, 0.24) |
| Phone : Female | -0.04 (0.07) | -0.04 (0.07) | 0.96 (0.80, 1.16) | 0.962 (0.845, 1.1) |
| Phone : High Income | 0.15 (0.05) | 0.15 (0.05) | 1.16 (1.01, 1.33) | 1.157 (1.051, 1.28) |
| Phone : Low Income | 0.11 (0.05) | 0.11 (0.05) | 1.11 (0.98, 1.27) | 1.112 (1.014, 1.22) |
| Phone : Not Cordless | 0 (0.07) | 0.01 (0.06) | 1 (0.84, 1.19) | 1.007 (0.89, 1.14) |
| Phone : Reconditioned | -0.18 (0.06) | -0.18 (0.06) | 0.83 (0.71, 0.98) | 0.832 (0.743, 0.93) |
| Phone : Sex Not Known | -0.05 (0.07) | -0.06 (0.07) | 0.95 (0.79, 1.14) | 0.946 (0.829, 1.08) |
| Porter Cable : agg_channel | 0.2 (0.16) | -1.3 (0.17) | 1.22 (0.80, 1.86) | 0.271 (0.196, 0.38) |
| Porter Cable : Amazon Sales | -0.65 (0.15) | -0.96 (0.15) | 0.52 (0.35, 0.77) | 0.384 (0.284, 0.52) |
| Porter Cable : eBay Sales | -0.37 (0.17) | -2.49 (0.18) | 0.69 (0.45, 1.08) | 0.083 (0.059, 0.12) |
| Porter Cable : Female | 0.13 (0.12) | -1.59 (0.1) | 1.13 (0.82, 1.56) | 0.203 (0.167, 0.25) |
| Porter Cable : High Income | 0.12 (0.09) | 0.86 (0.07) | 1.12 (0.89, 1.42) | 2.352 (2.032, 2.72) |
| Porter Cable : Low Income | 0.11 (0.09) | -1.56 (0.07) | 1.12 (0.89, 1.40) | 0.21 (0.183, 0.24) |
| Porter Cable : Not Cordless | -0.13 (0.1) | 1.93 (0.09) | 0.88 (0.67, 1.15) | 6.865 (5.78, 8.15) |
| Porter Cable : Phone | -0.08 (0.15) | 0.35 (0.14) | 0.92 (0.62, 1.35) | 1.425 (1.084, 1.87) |
| Porter Cable : Reconditioned | 0.01 (0.1) | 0.15 (0.09) | 1.01 (0.78, 1.32) | 1.163 (0.982, 1.38) |
| Porter Cable : Sex Not Known | -0.22 (0.12) | -2.18 (0.1) | 0.8 (0.58, 1.10) | 0.113 (0.093, 0.14) |
| Powermatic : agg_channel | 0.23 (0.42) | -2.35 (0.36) | 1.26 (0.43, 3.67) | 0.096 (0.047, 0.19) |
| Powermatic : Amazon Sales | 1.79 (0.26) | 0.41 (0.22) | 6.01 (3.08, 11.75) | 1.512 (0.976, 2.34) |
| Powermatic : eBay Sales | 1.1 (0.33) | -2.1 (0.29) | 2.99 (1.27, 7.04) | 0.123 (0.07, 0.22) |
| Powermatic : Female | -0.82 (0.24) | -2.54 (0.22) | 0.44 (0.24, 0.82) | 0.079 (0.051, 0.12) |
| Powermatic : High Income | 0.14 (0.18) | 0.86 (0.16) | 1.15 (0.73, 1.80) | 2.375 (1.741, 3.24) |
| Powermatic : Low Income | -0.16 (0.16) | -1.83 (0.15) | 0.85 (0.56, 1.30) | 0.16 (0.12, 0.21) |
| Powermatic : Phone | 1.19 (0.26) | 0.55 (0.22) | 3.28 (1.66, 6.48) | 1.733 (1.134, 2.65) |
| Powermatic : Sex Not Known | -0.44 (0.23) | -2.39 (0.21) | 0.65 (0.35, 1.18) | 0.091 (0.06, 0.14) |
| Ridgid : agg_channel | 0.93 (0.17) | -1.76 (0.17) | 2.53 (1.63, 3.93) | 0.172 (0.123, 0.24) |
| Ridgid : Amazon Sales | 0.23 (0.16) | -1.25 (0.16) | 1.26 (0.84, 1.900) | 0.288 (0.21, 0.39) |
| Ridgid : eBay Sales | 1.53 (0.17) | -1.75 (0.18) | 4.63 (3.00, 7.15) | 0.173 (0.122, 0.25) |
| Ridgid : Female | -0.01 (0.13) | -1.73 (0.11) | 0.99 (0.71, 1.39) | 0.178 (0.144, 0.22) |
| Ridgid : High Income | 0.13 (0.1) | 0.87 (0.08) | 1.14 (0.88, 1.47) | 2.388 (2.028, 2.81) |
| Ridgid : Low Income | 0.06 (0.09) | -1.61 (0.08) | 1.06 (0.84, 1.35) | 0.2 (0.172, 0.23) |
| Ridgid : Not Cordless | -1.16 (0.11) | 0.9 (0.1) | 0.31 (0.24, 0.42) | 2.456 (2.031, 2.97) |

| Table 7 Model comparisons (cont.) | glm.poisson.disp | glm.nb | glm.poisson.disp | glm.nb |
|-----------------------------------|--------------------|---------------------|--------------------------|----------------------------|
| Parameters | coef (se) | coef (se) | Odds Ratio (95% CI) | Odds Ratio (95% CI) |
| Ridgid : Phone | -0.43 (0.17) | -1.17 (0.16) | 0.65 (0.42, 1.00) | 0.31 (0.226, 0.42) |
| Ridgid : Reconditioned | 0.63 (0.11) | 0.77 (0.1) | 1.88 (1.41, 2.51) | 2.169 (1.796, 2.62) |
| Ridgid : Sex Not Known | -0.16 (0.13) | -2.11 (0.11) | 0.86 (0.61, 1.20) | 0.121 (0.098, 0.15) |
| Ryobi : agg_channel | 0.52 (0.18) | -3.89 (0.21) | 1.68 (1.06, 2.65) | 0.02 (0.014, 0.03) |
| Ryobi : Amazon Sales | 0.67 (0.16) | -2.55 (0.19) | 1.95 (1.28, 2.95) | 0.078 (0.054, 0.11) |
| Ryobi : eBay Sales | 1.72 (0.17) | -3.31 (0.19) | 5.56 (3.62, 8.53) | 0.037 (0.025, 0.05) |
| Ryobi : Female | 0.37 (0.13) | -1.35 (0.11) | 1.44 (1.03, 2.02) | 0.259 (0.208, 0.32) |
| Ryobi : High Income | 0 (0.1) | 0.74 (0.08) | 1 (0.78, 1.27) | 2.09 (1.779, 2.45) |
| Ryobi : Low Income | 0.07 (0.09) | -1.61 (0.08) | 1.07 (0.84, 1.36) | 0.201 (0.172, 0.23) |
| Ryobi : Not Cordless | 1.05 (0.12) | 3.1 (0.11) | 2.84 (2.07, 3.91) | 22.099 (17.685, 27.61) |
| Ryobi : Phone | -0.78 (0.17) | -3.25 (0.18) | 0.46 (0.30, 0.71) | 0.039 (0.027, 0.06) |
| Ryobi : Reconditioned | 2.09 (0.12) | 2.23 (0.11) | 8.09 (5.87, 11.16) | 9.267 (7.431, 11.56) |
| Ryobi : Sex Not Known | 0.03 (0.13) | -1.92 (0.11) | 1.03 (0.73, 1.45) | 0.146 (0.117, 0.18) |
| Senco : agg_channel | 0.43 (0.21) | -4.73 (0.23) | 1.54 (0.90, 2.64) | 0.009 (0.006, 0.01) |
| Senco : Amazon Sales | 0.54 (0.17) | -3.41 (0.19) | 1.72 (1.11, 2.66) | 0.033 (0.023, 0.05) |
| Senco : eBay Sales | 1.15 (0.19) | -4.61 (0.21) | 3.16 (1.96, 5.09) | 0.01 (0.007, 0.01) |
| Senco : Female | 0.03 (0.15) | -1.69 (0.13) | 1.03 (0.71, 1.49) | 0.184 (0.143, 0.24) |
| Senco : High Income | 0.27 (0.11) | 1.01 (0.1) | 1.31 (0.98, 1.74) | 2.744 (2.273, 3.31) |
| Senco : Low Income | 0.09 (0.1) | -1.59 (0.09) | 1.09 (0.84, 1.42) | 0.205 (0.173, 0.24) |
| Senco : Not Cordless | 0.87 (0.13) | 2.93 (0.12) | 2.4 (1.70, 3.39) | 18.692 (14.782, 23.64) |
| Senco : Phone | 0.16 (0.18) | -3.05 (0.18) | 1.17 (0.75, 1.85) | 0.047 (0.033, 0.07) |
| Senco : Reconditioned | 0.76 (0.12) | 0.89 (0.11) | 2.13 (1.55, 2.93) | 2.445 (1.975, 3.03) |
| Senco : Sex Not Known | -0.16 (0.15) | -2.11 (0.13) | 0.85 (0.58, 1.24) | 0.121 (0.094, 0.16) |
| Sex Not Known : Not Cordless | -0.1 (0.06) | -0.1 (0.05) | 0.9 (0.78, 1.04) | 0.907 (0.819, 1) |
| Sex Not Known : Reconditioned | -0.11 (0.05) | -0.1 (0.05) | 0.9 (0.79, 1.02) | 0.901 (0.82, 0.99) |
| Skil : agg_channel | -0.27 (0.16) | -1.81 (0.14) | 0.76 (0.50, 1.16) | 0.163 (0.125, 0.21) |
| Skil : Amazon Sales | -0.11 (0.15) | -0.45 (0.12) | 0.89 (0.61, 1.31) | 0.637 (0.505, 0.8) |
| Skil : eBay Sales | 0.59 (0.15) | -1.56 (0.12) | 1.8 (1.21, 2.68) | 0.21 (0.164, 0.27) |
| Skil : Female | 0.57 (0.12) | -1.15 (0.1) | 1.77 (1.30, 2.41) | 0.317 (0.263, 0.38) |
| Skil : High Income | 0.14 (0.09) | 0.88 (0.07) | 1.15 (0.92, 1.45) | 2.411 (2.093, 2.78) |
| Skil : Low Income | 0.13 (0.08) | -1.54 (0.07) | 1.14 (0.92, 1.42) | 0.214 (0.187, 0.24) |
| Skil : Not Cordless | 0.07 (0.1) | 2.12 (0.09) | 1.07 (0.83, 1.39) | 8.291 (7.015, 9.8) |
| Skil : Reconditioned | 0.23 (0.1) | 0.37 (0.08) | 1.26 (0.97, 1.63) | 1.448 (1.231, 1.7) |
| Skil : Sex Not Known | -0.1 (0.12) | -2.05 (0.1) | 0.9 (0.66, 1.23) | 0.128 (0.106, 0.16) |

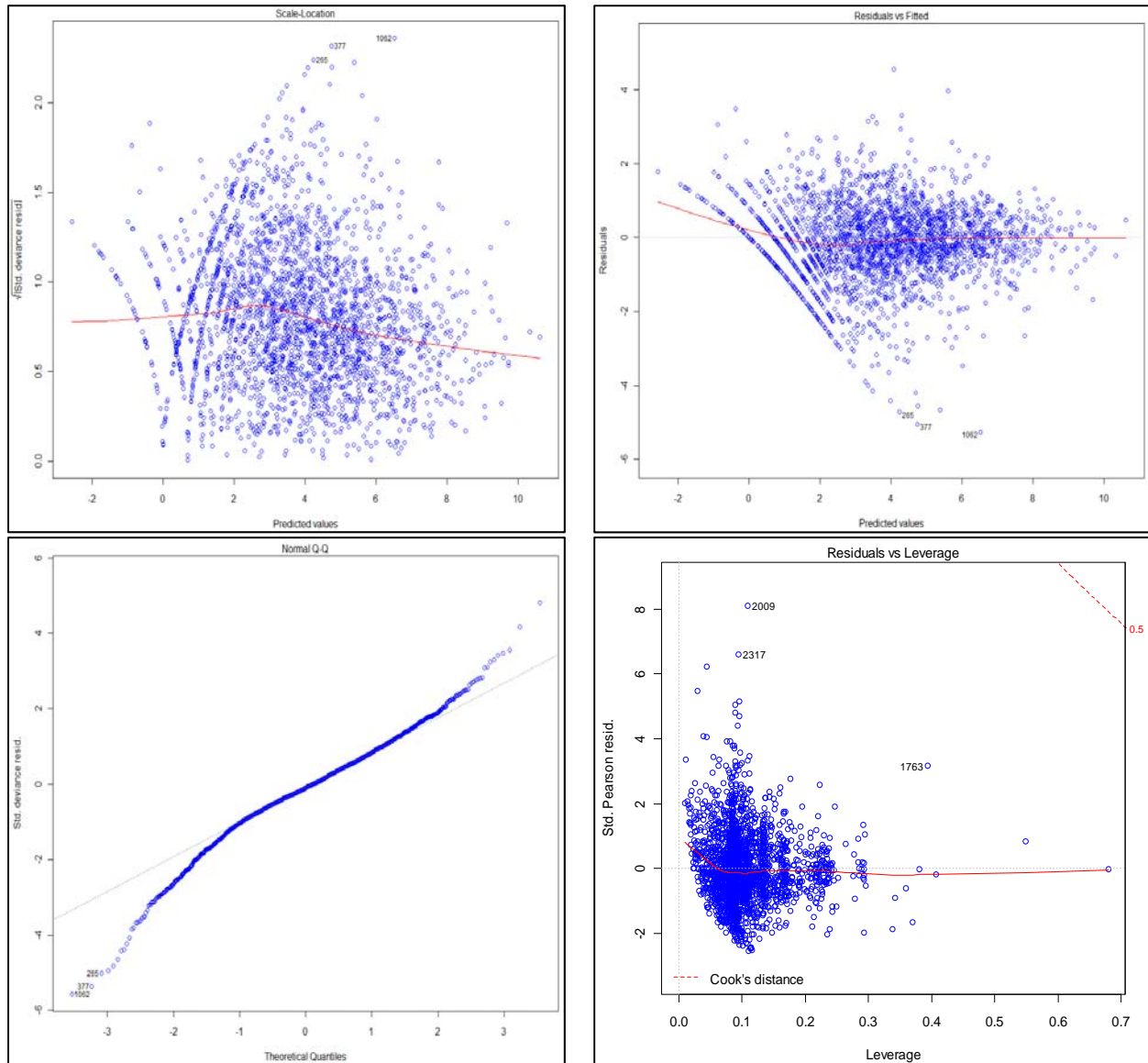
Table 9. Additional parameters output by glm.nb.

* All estimates are rounded to the 2nd decimal.

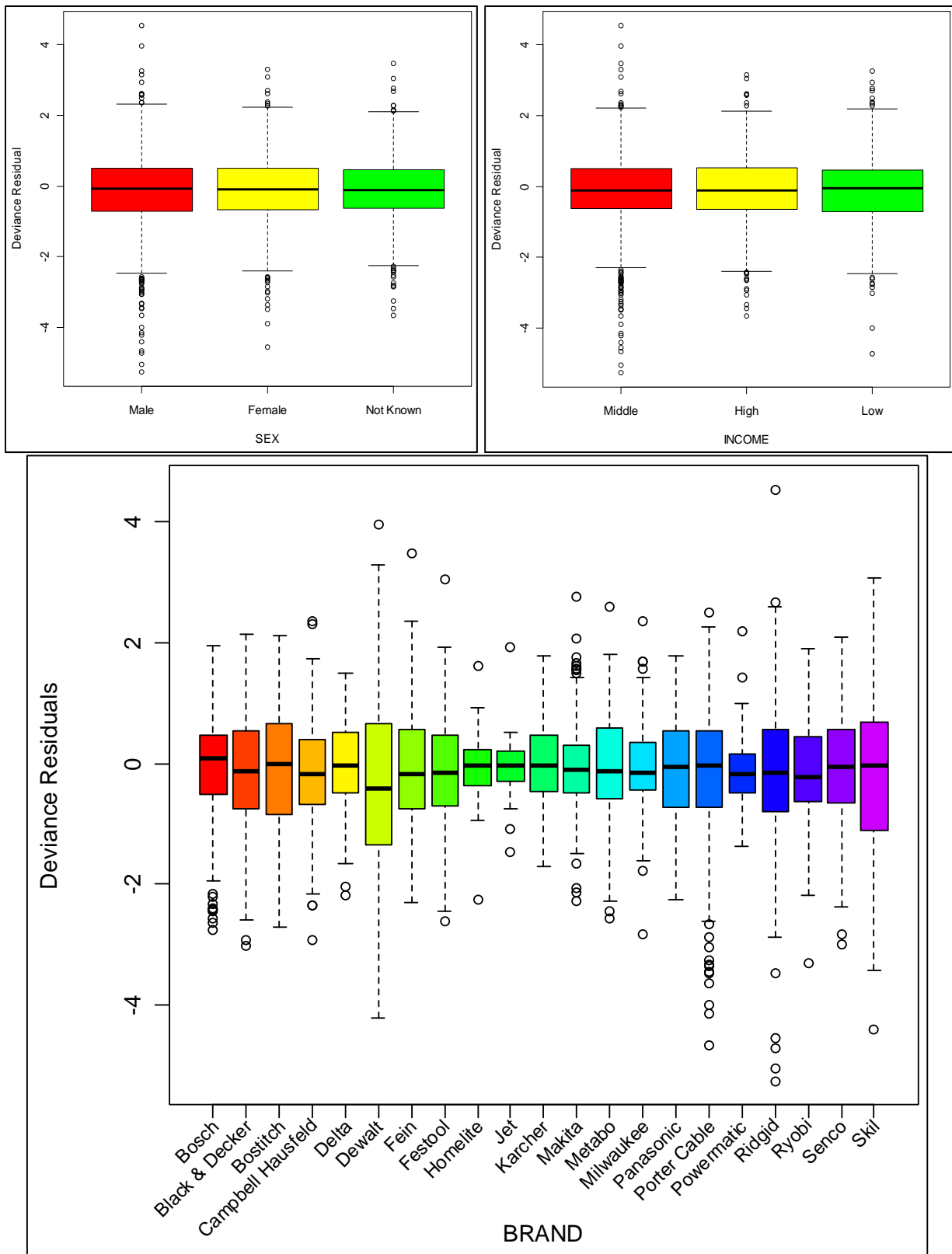
| Parameters | coef (se) | Odds ratio (95% CI) |
|---------------------------------|--------------|----------------------|
| Black & Decker : Branded Web | 1.13 (0.15)* | 3.09 (2.31, 4.14) |
| Bosch : agg_channel | -0.64 (0.16) | 0.53 (0.39, 0.71) |
| Bosch : Amazon Sales | 0.56 (0.15) | 1.76 (1.32, 2.35) |
| Bosch : Branded Web | 2.64 (0.15) | 13.95 (10.47, 18.58) |
| Bosch : eBay Sales | -1.25 (0.15) | 0.29 (0.21, 0.39) |
| Bosch : Female | -1.72 (0.09) | 0.18 (0.15, 0.22) |
| Bosch : High Income | 0.74 (0.07) | 2.1 (1.83, 2.41) |
| Bosch : Low Income | -1.67 (0.07) | 0.19 (0.16, 0.21) |
| Bosch : Not Cordless | 2.05 (0.08) | 7.78 (6.61, 9.16) |
| Bosch : Phone | 1.3 (0.14) | 3.68 (2.82, 4.8) |
| Bosch : Reconditioned | 0.14 (0.08) | 1.15 (0.98, 1.35) |
| Bosch : Sex Not Known | -1.95 (0.09) | 0.14 (0.12, 0.17) |
| Bostitch : Branded Web | 2.65 (0.17) | 14.13 (10.19, 19.59) |
| Campbell Hausfeld : Branded Web | -0.68 (0.16) | 0.51 (0.37, 0.69) |
| Delta : Branded Web | 3.21 (0.18) | 24.68 (17.44, 34.91) |
| Dewalt : Branded Web | 2.21 (0.15) | 9.1 (6.81, 12.16) |
| Fein : Branded Web | -2.5 (0.24) | 0.08 (0.05, 0.13) |
| Festool : Branded Web | -1.45 (0.21) | 0.23 (0.15, 0.35) |
| Homelite : Branded Web | -3.75 (0.46) | 0.02 (0.01, 0.06) |
| Jet : Branded Web | 2.67 (0.2) | 14.41 (9.75, 21.3) |
| Karcher : Branded Web | -2.31 (0.37) | 0.1 (0.05, 0.21) |
| Makita : Branded Web | 2.09 (0.15) | 8.11 (6.07, 10.83) |
| Metabo : Branded Web | -1.8 (0.21) | 0.17 (0.11, 0.25) |
| Milwaukee : Branded Web | 2.92 (0.15) | 18.59 (13.94, 24.78) |
| Panasonic : Branded Web | -0.38 (0.17) | 0.68 (0.49, 0.96) |
| Porter Cable : Branded Web | 1.77 (0.15) | 5.86 (4.38, 7.86) |
| Powermatic : Branded Web | 0.7 (0.21) | 2.01 (1.32, 3.06) |
| Ridgid : Branded Web | 0.59 (0.16) | 1.8 (1.31, 2.48) |
| Ryobi : Branded Web | -1.14 (0.19) | 0.32 (0.22, 0.46) |
| Senco : Branded Web | -1.88 (0.18) | 0.15 (0.11, 0.22) |
| Skil : Branded Web | 1.73 (0.12) | 5.64 (4.5, 7.07) |

Appendix 1-B: glm.nb

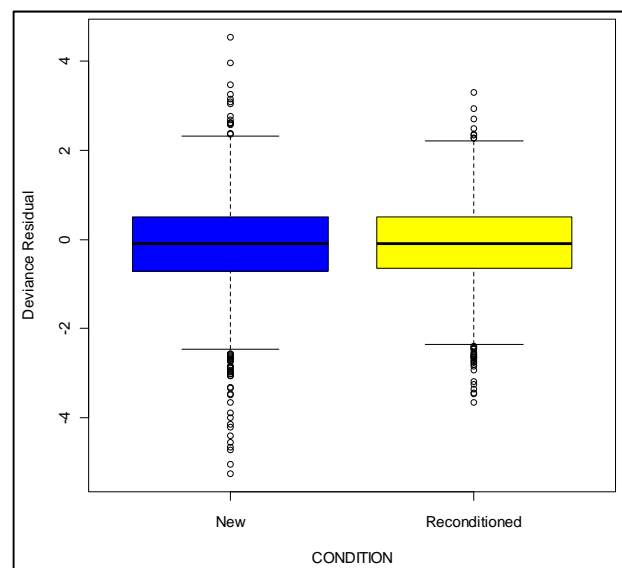
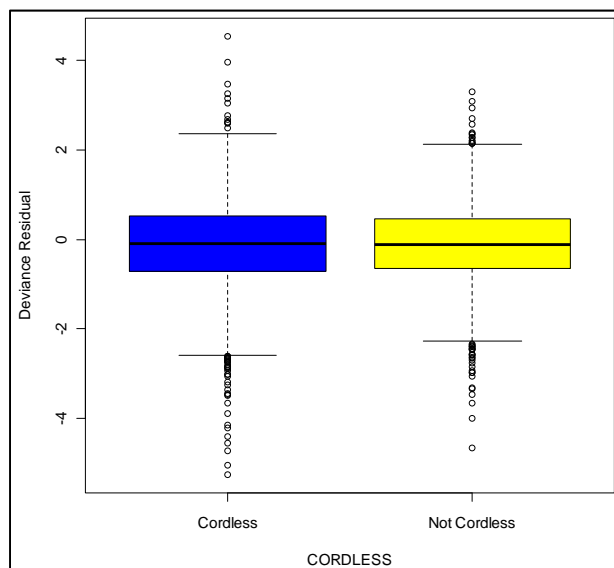
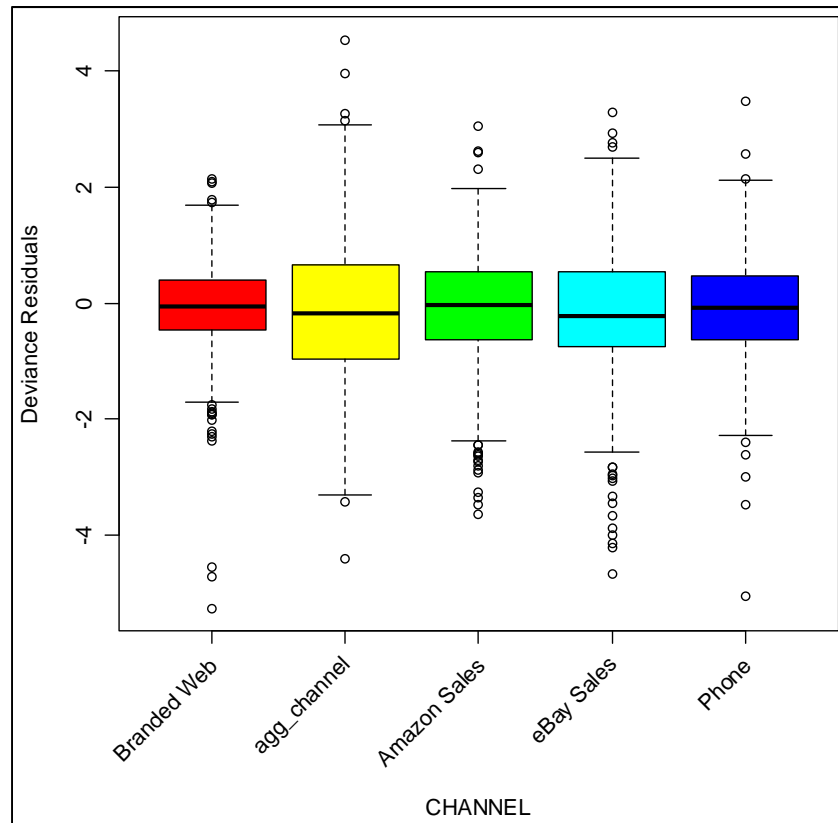
1-B.1: Residual Diagnostics



1-B.2: Univariate standardized deviance residual boxplots (Sex, Income, and Brand)

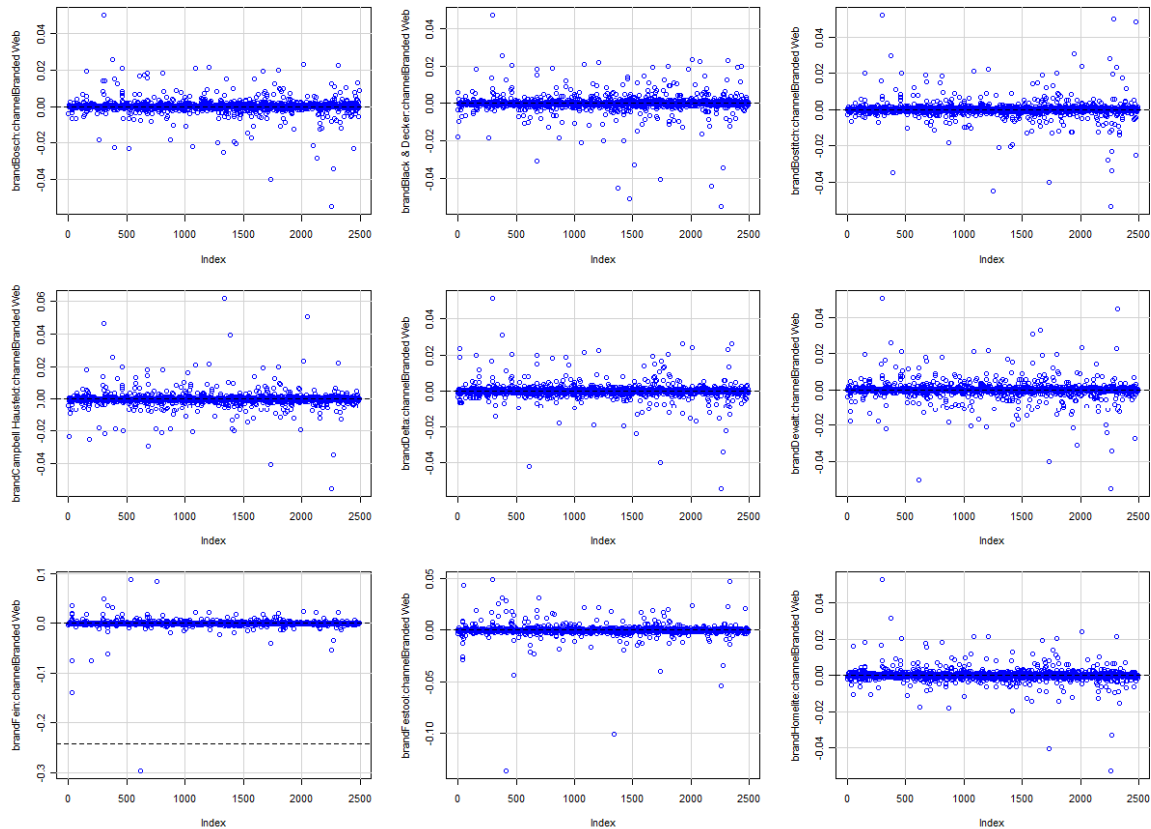


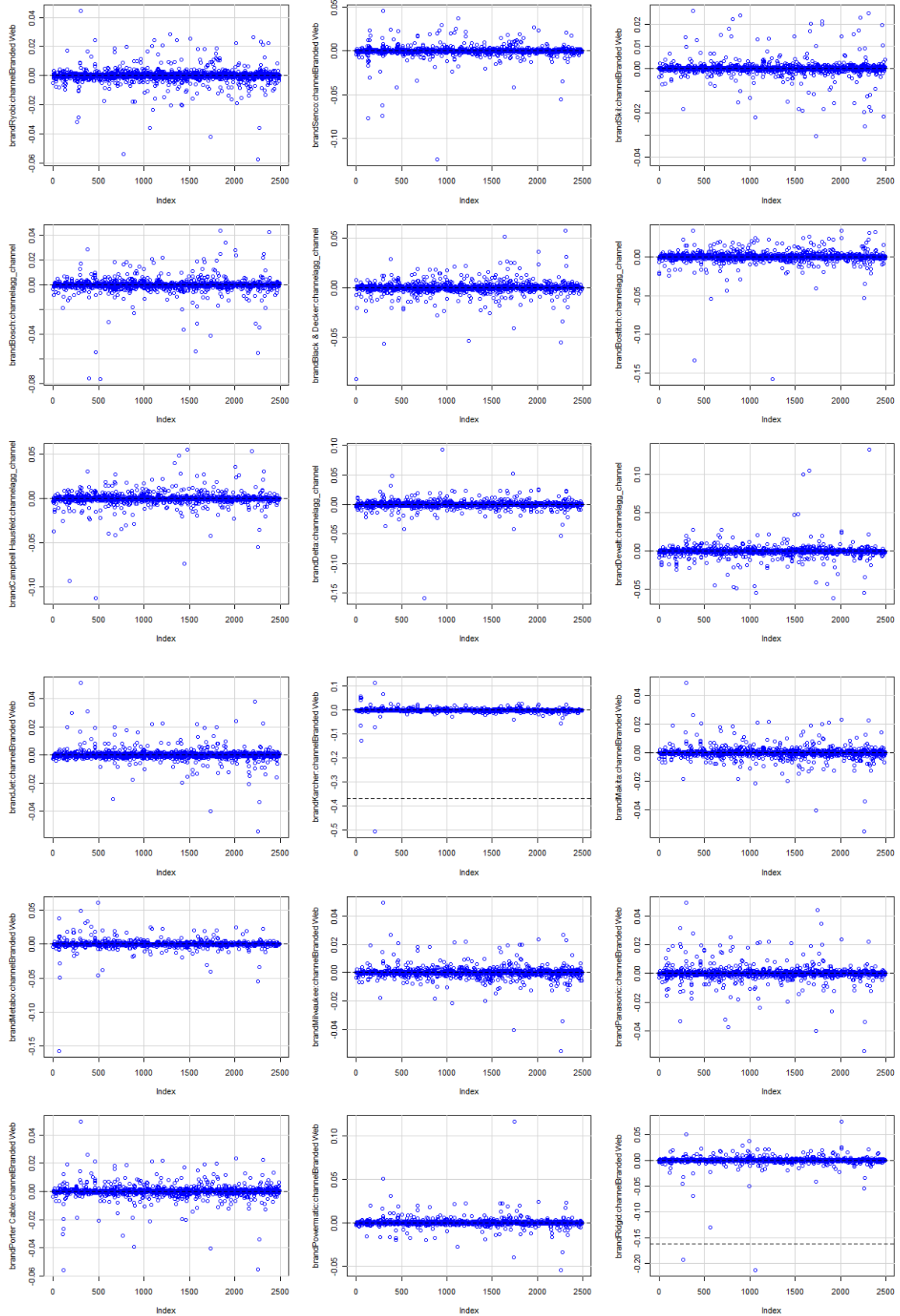
1-B.3: Univariate standardized deviance residual boxplots (Channel, Cordless, and Condition)

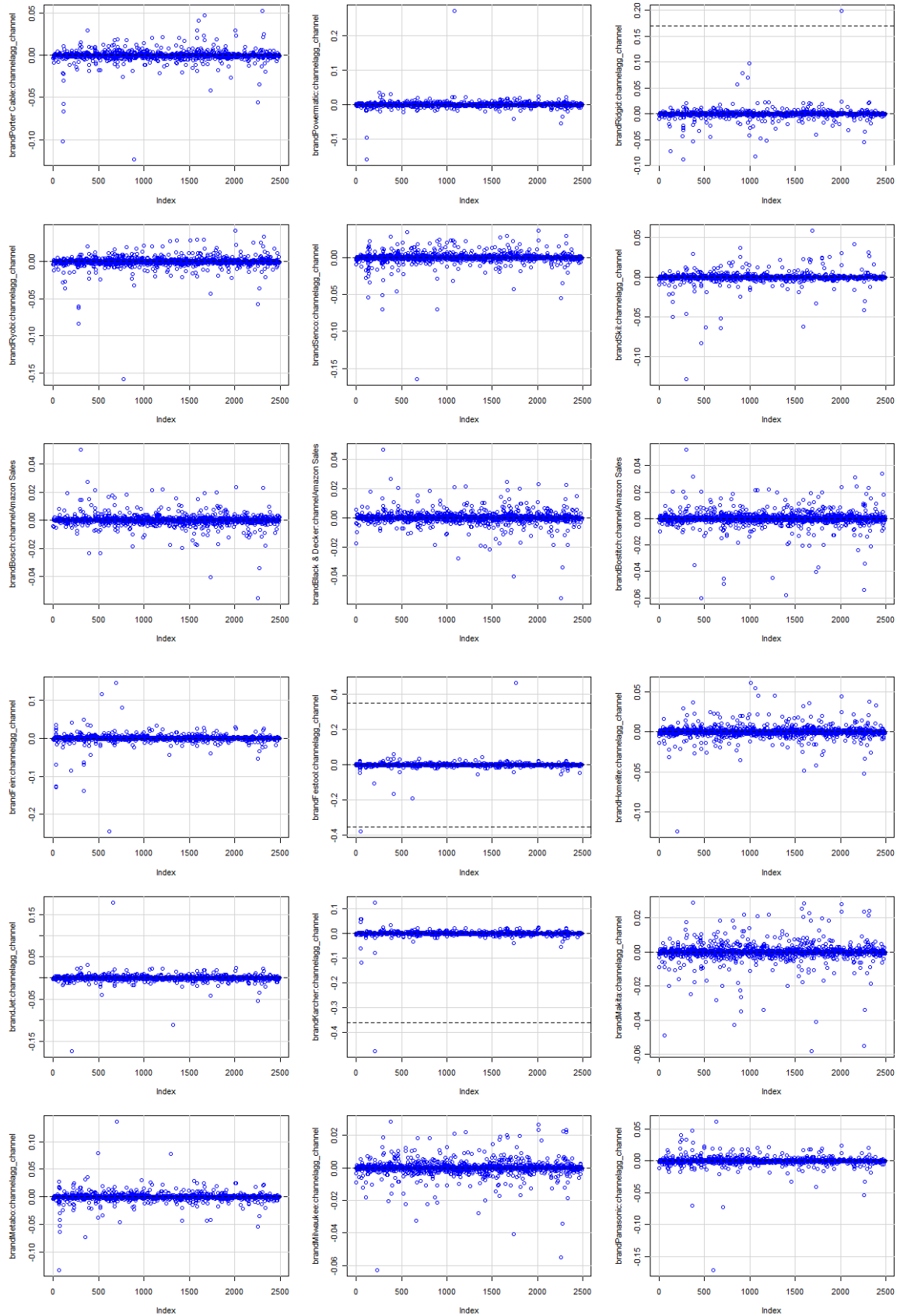


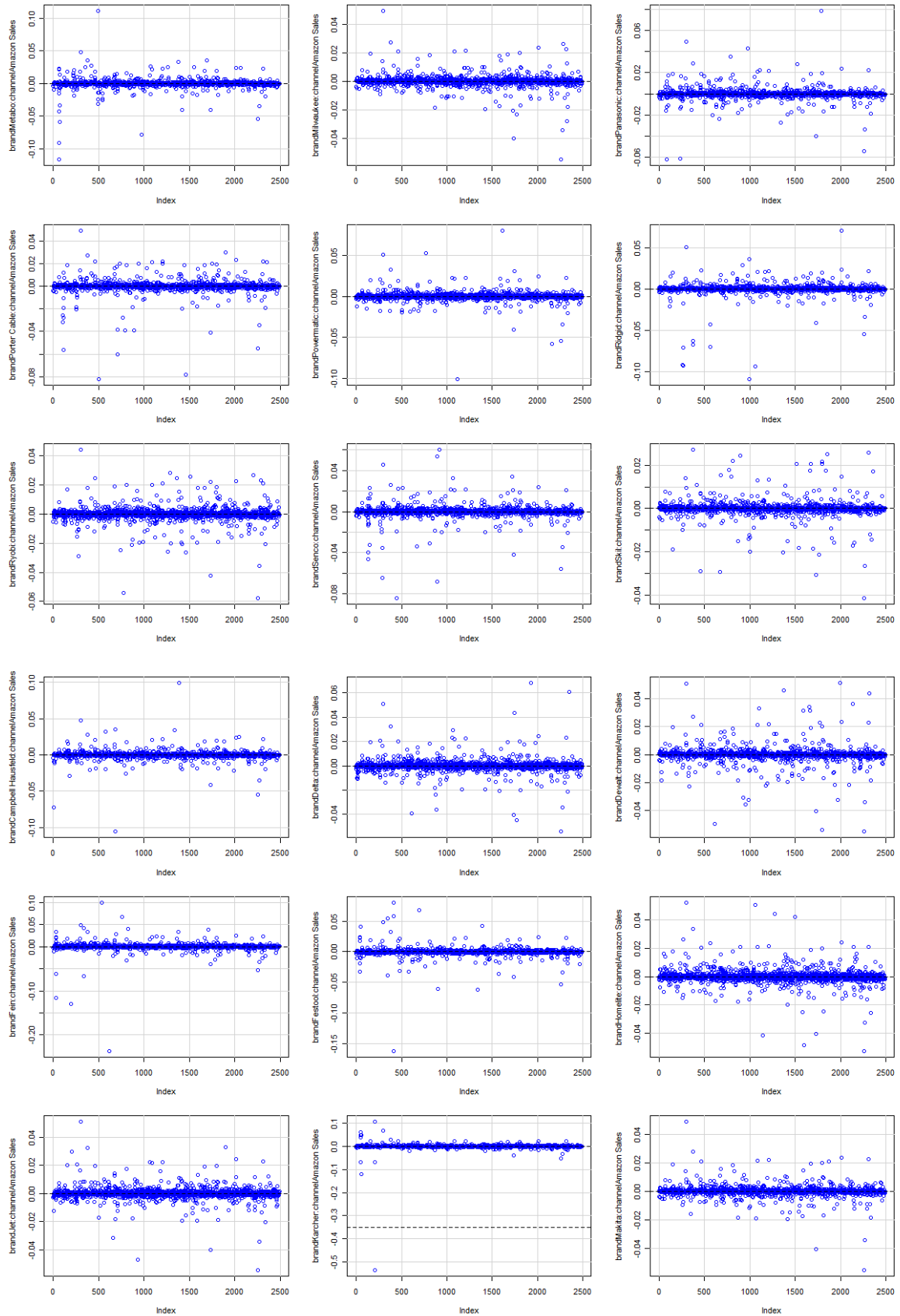
1-B.4: DF Beta Plots

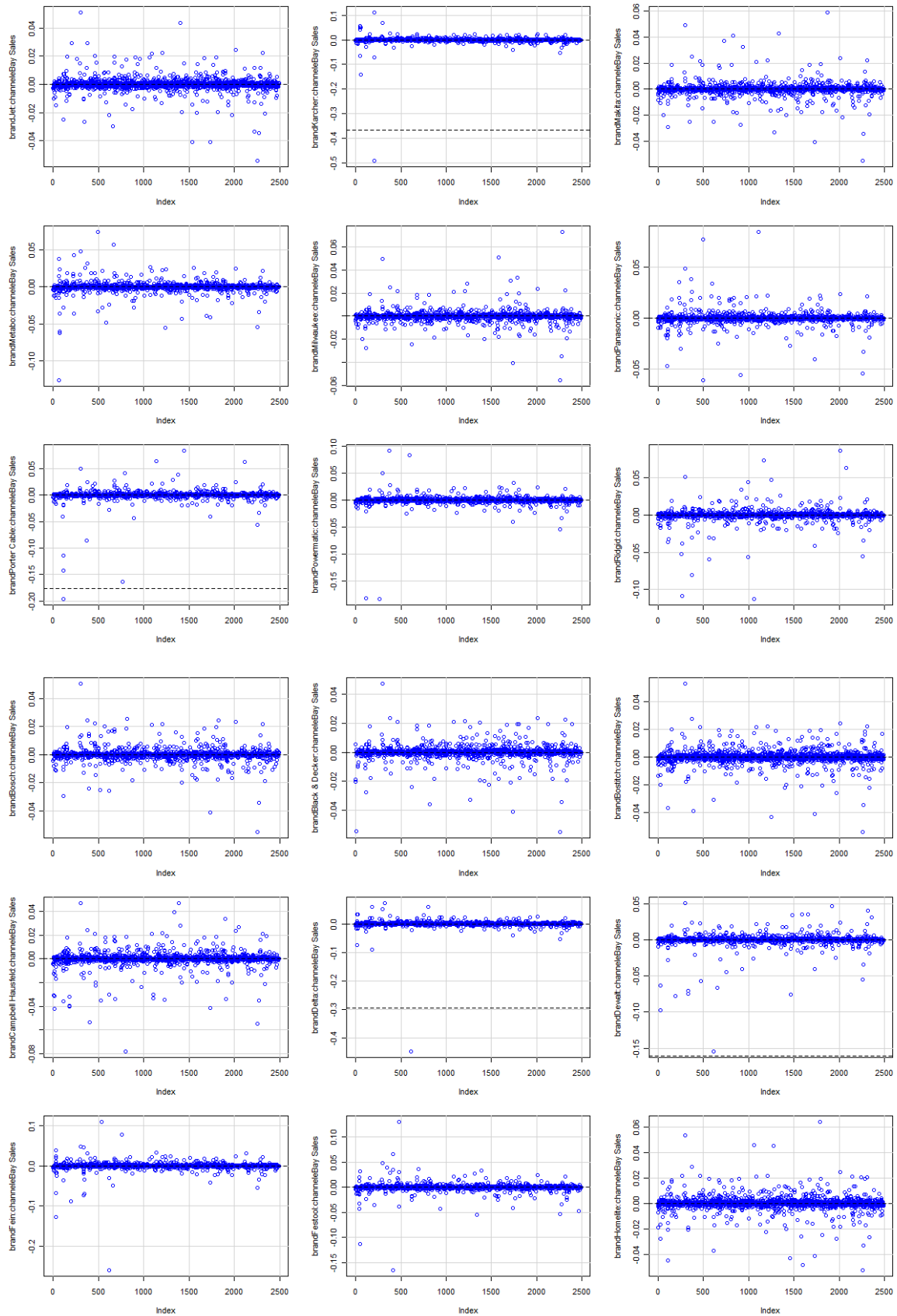
Description from the R Documentation: “These functions display index plots of `dfbeta` (effect on coefficients of deleting each observation in turn) and `dfbetas` (effect on coefficients of deleting each observation in turn, standardized by a deleted estimate of the coefficient standard error). In the plot of `dfbeta`, horizontal lines are drawn at 0 and \pm one standard error; in the plot of `dfbetas`, horizontal lines are drawn at 0 and \pm 1.” <http://hosho.ees.hokudai.ac.jp/~kubo/Rdoc/library/car/html/dfbetaPlots.html>

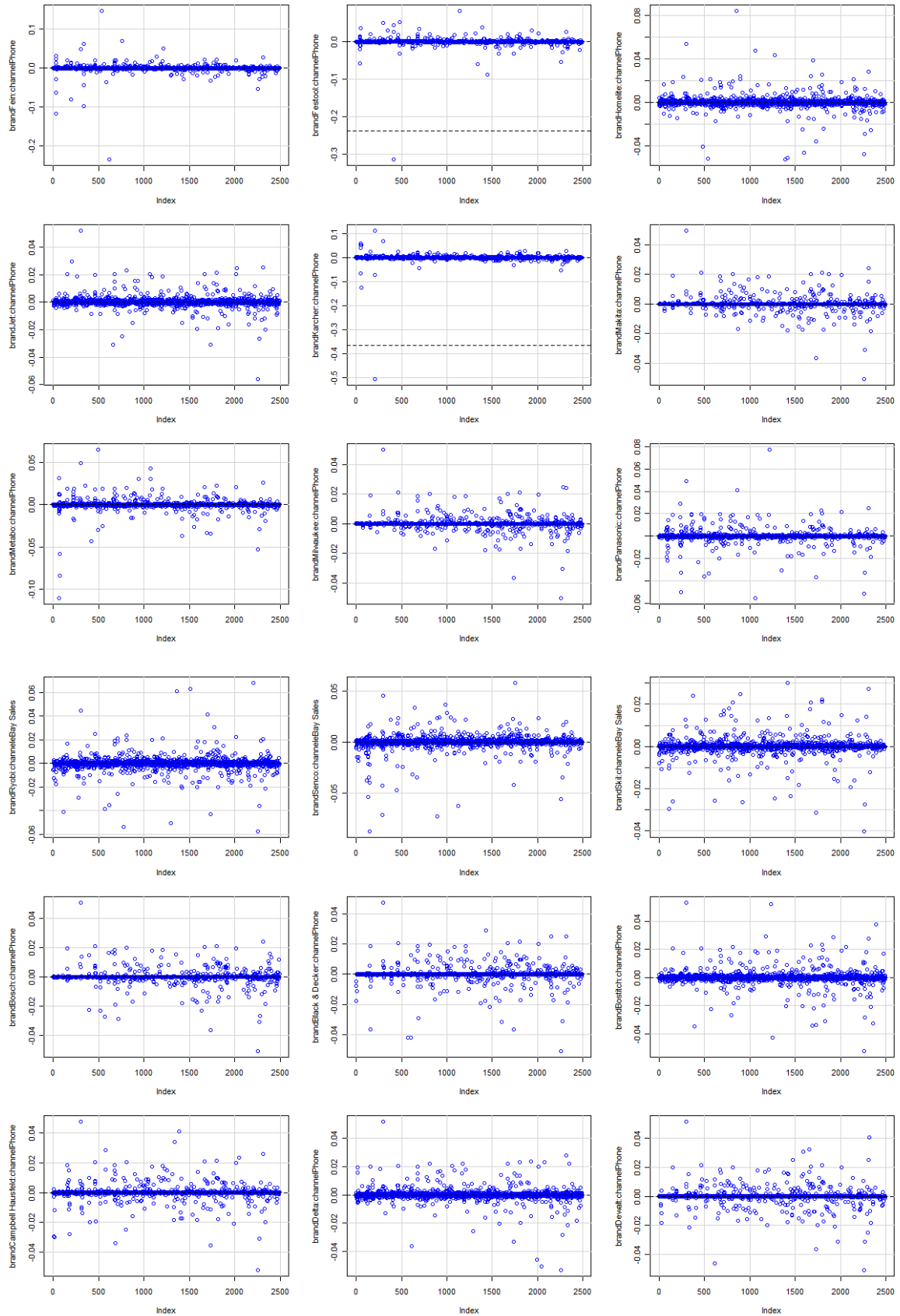


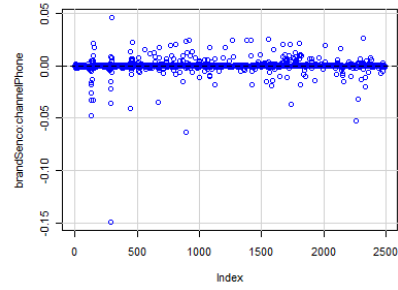
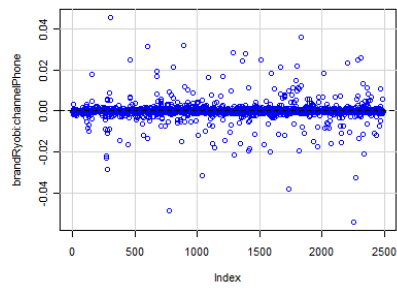
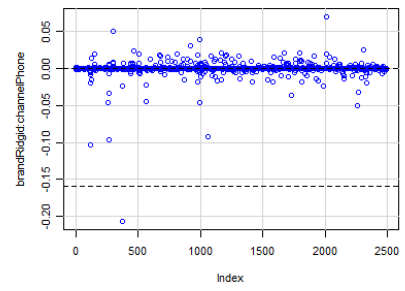
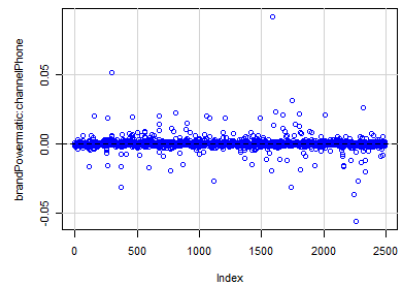
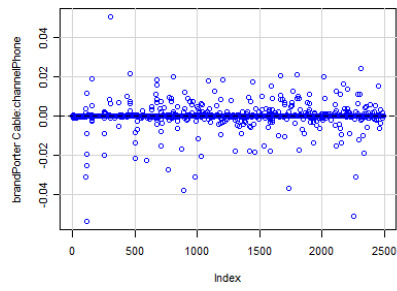






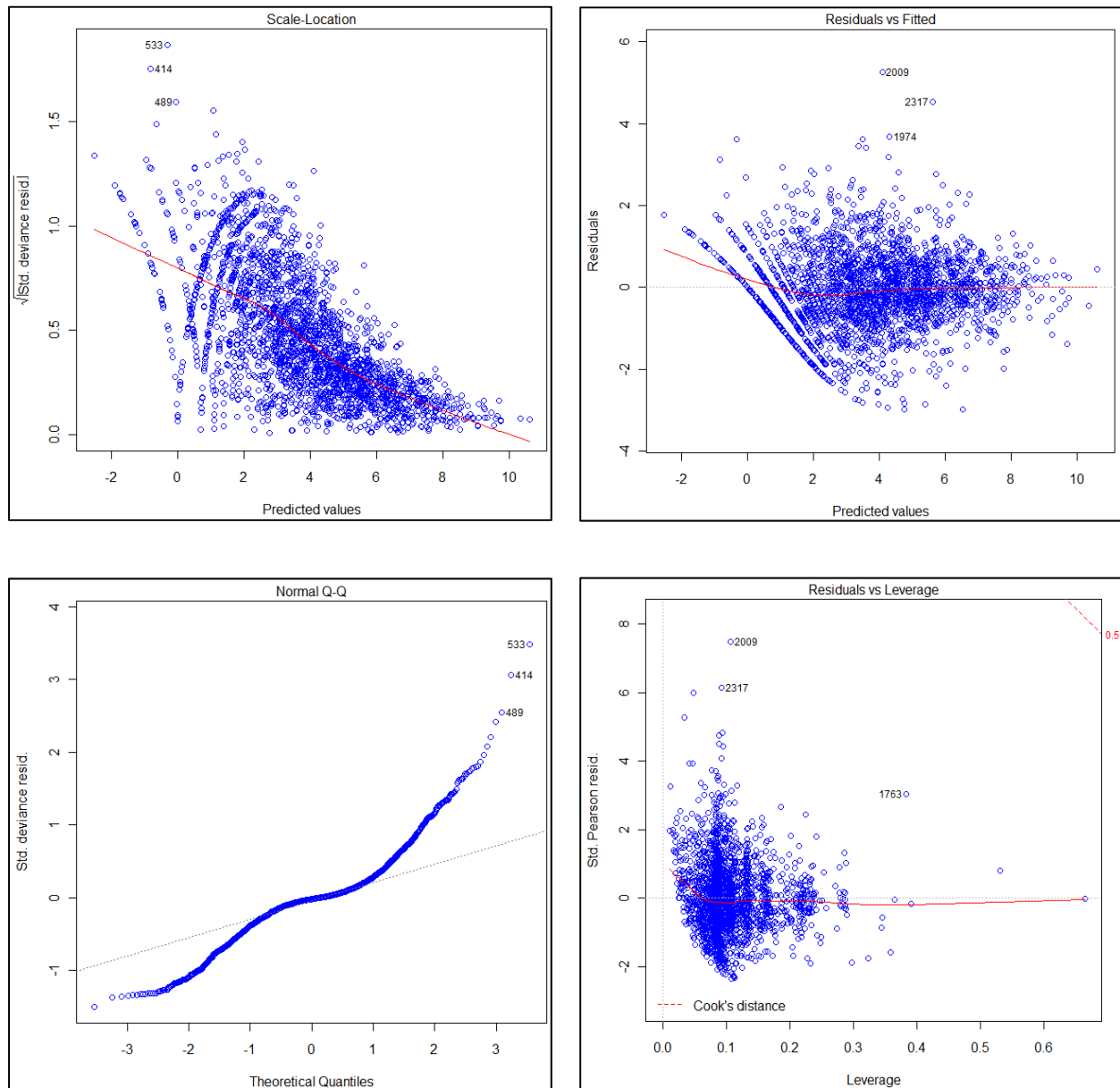




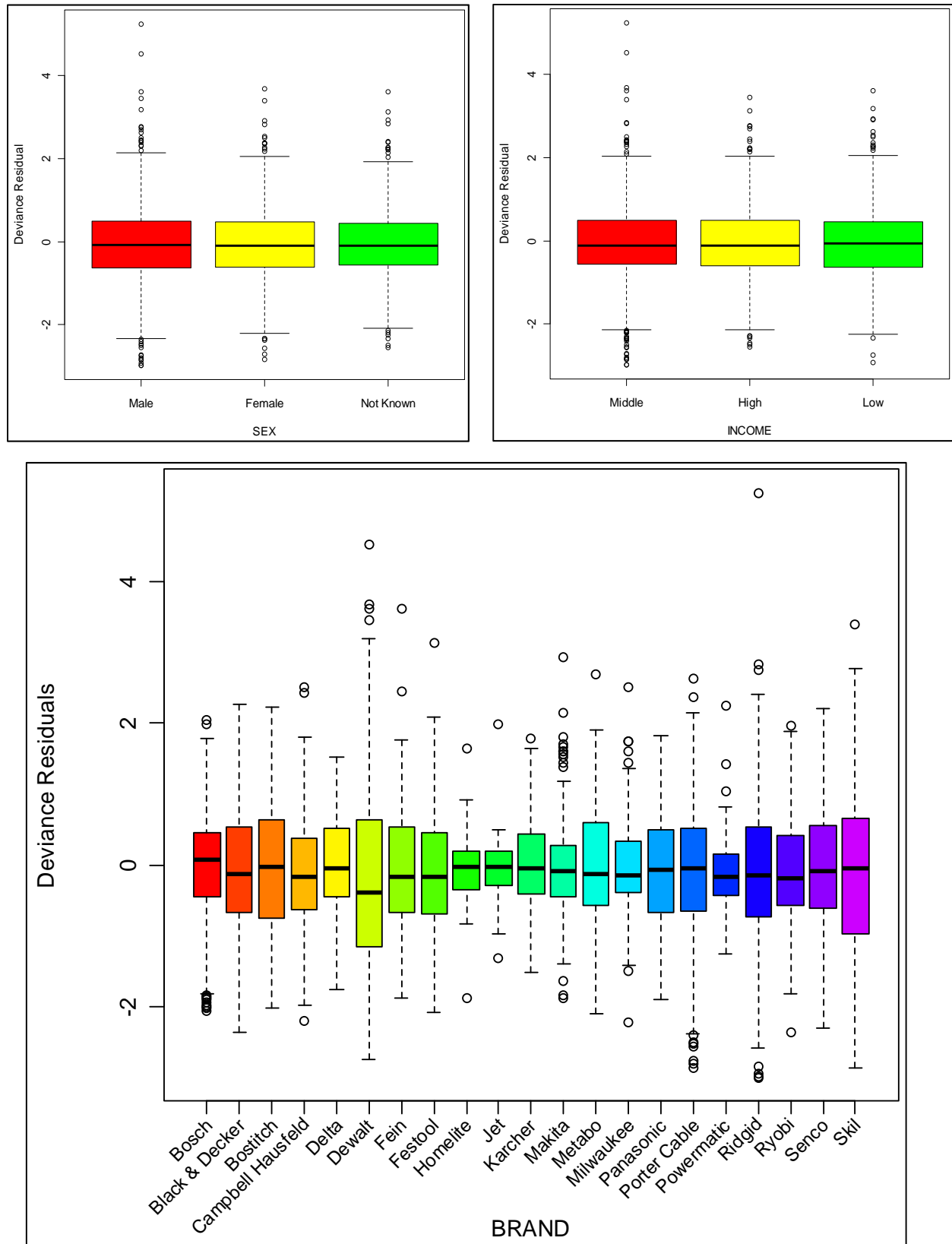


Appendix 1-C: glm.poisson.disp

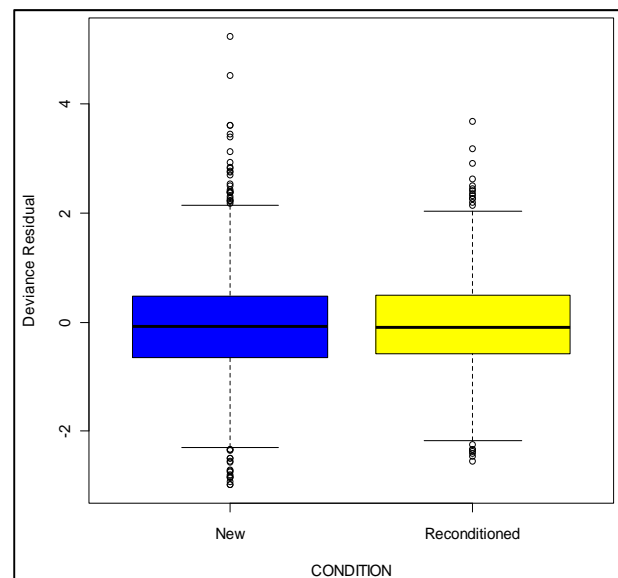
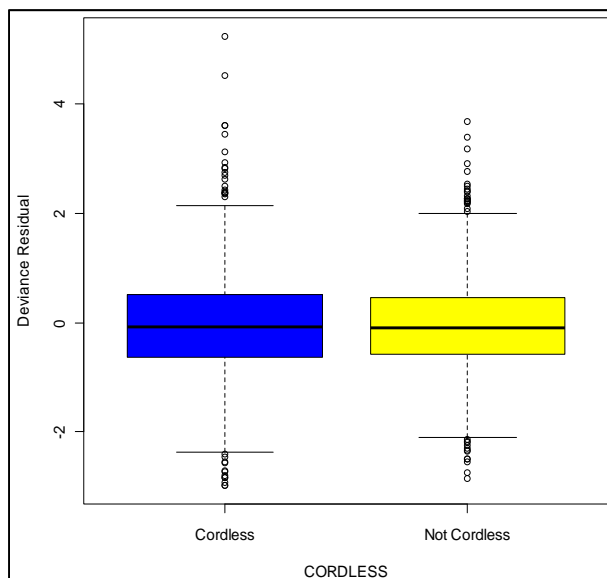
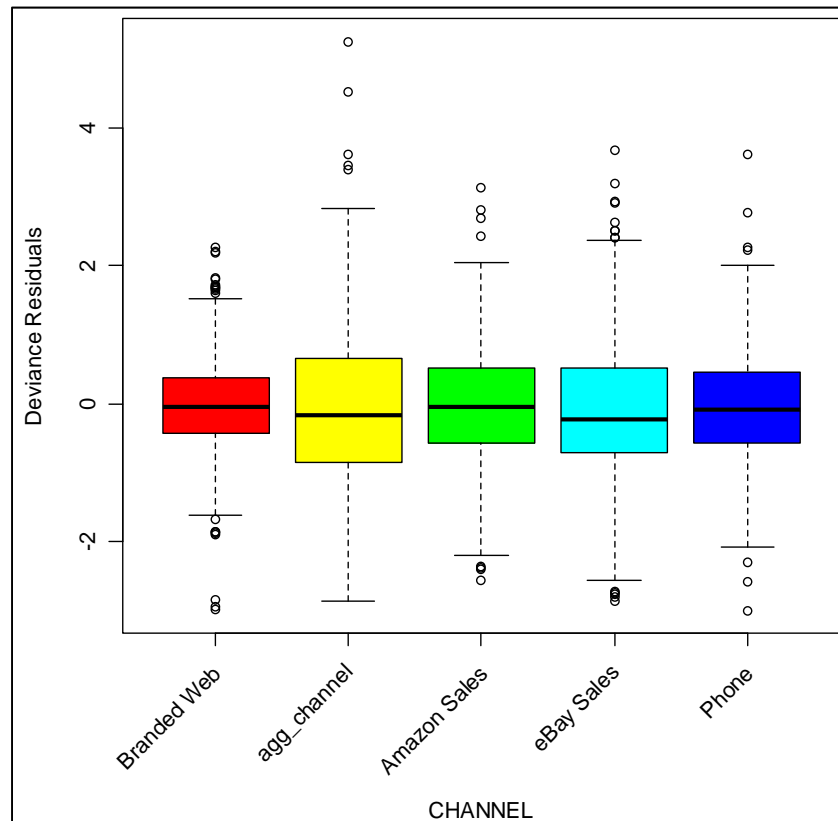
1-C.1: Residual Diagnostics



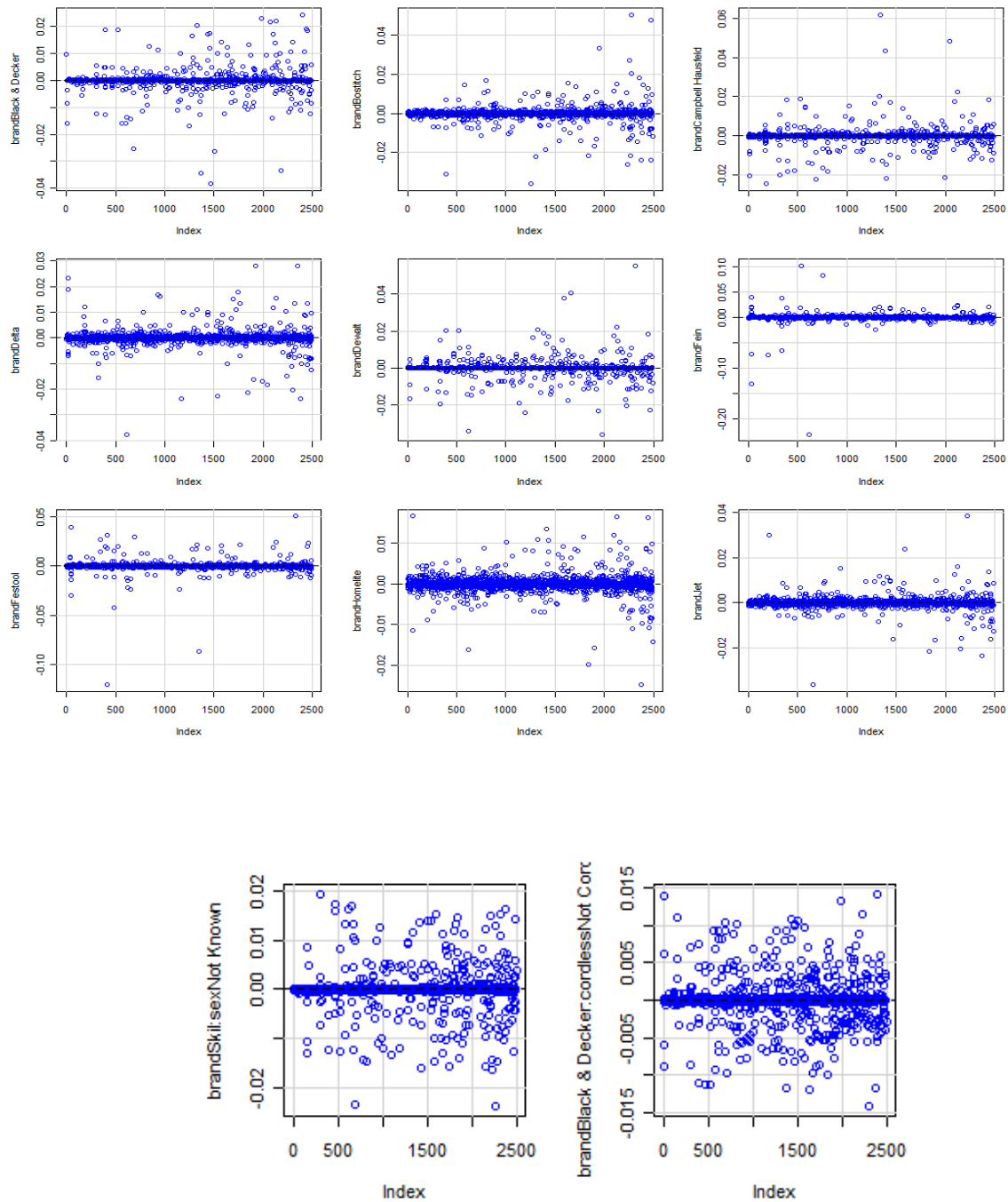
1-C.2: Univariate standardized deviance residual boxplots (Sex, Income, and Brand)

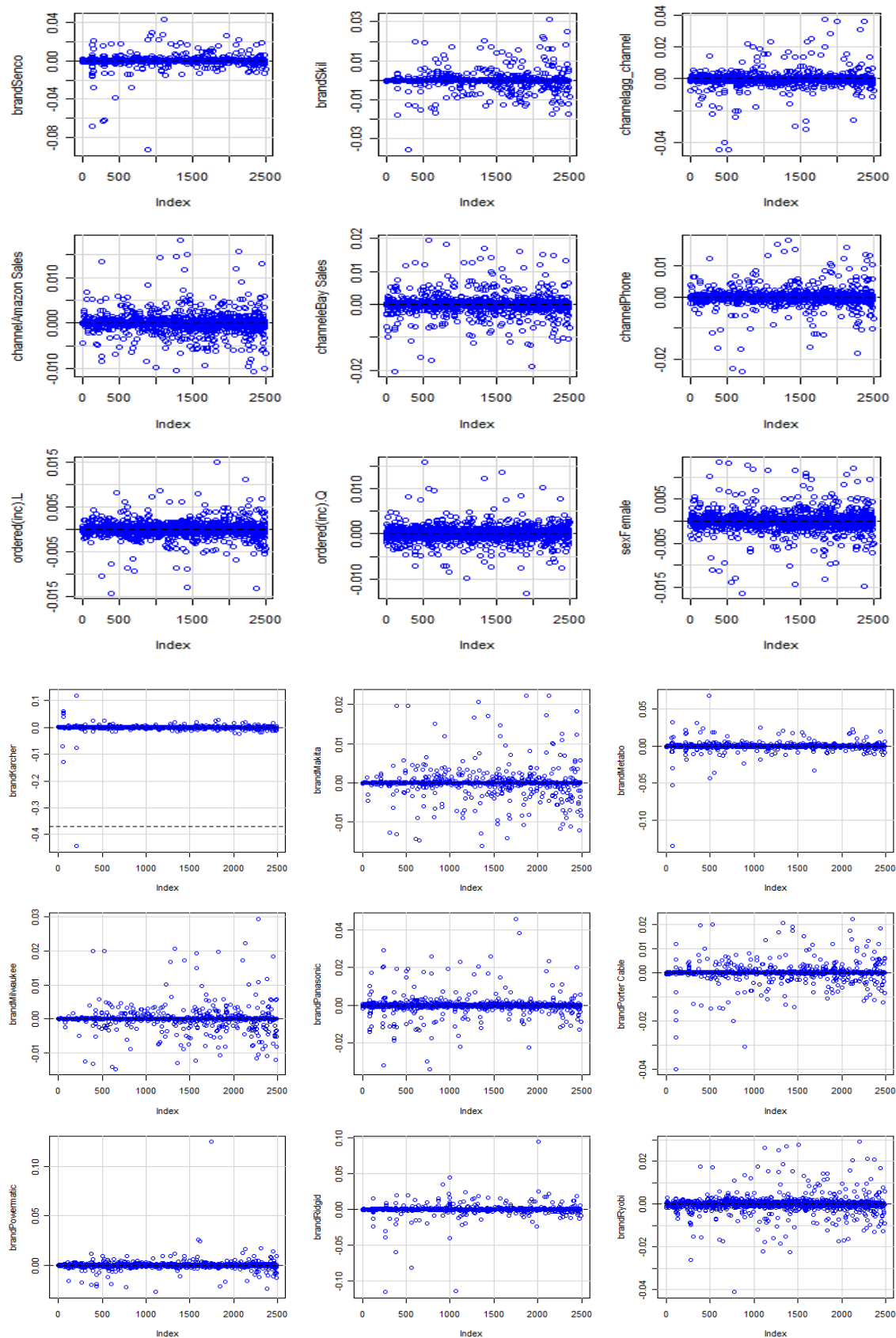


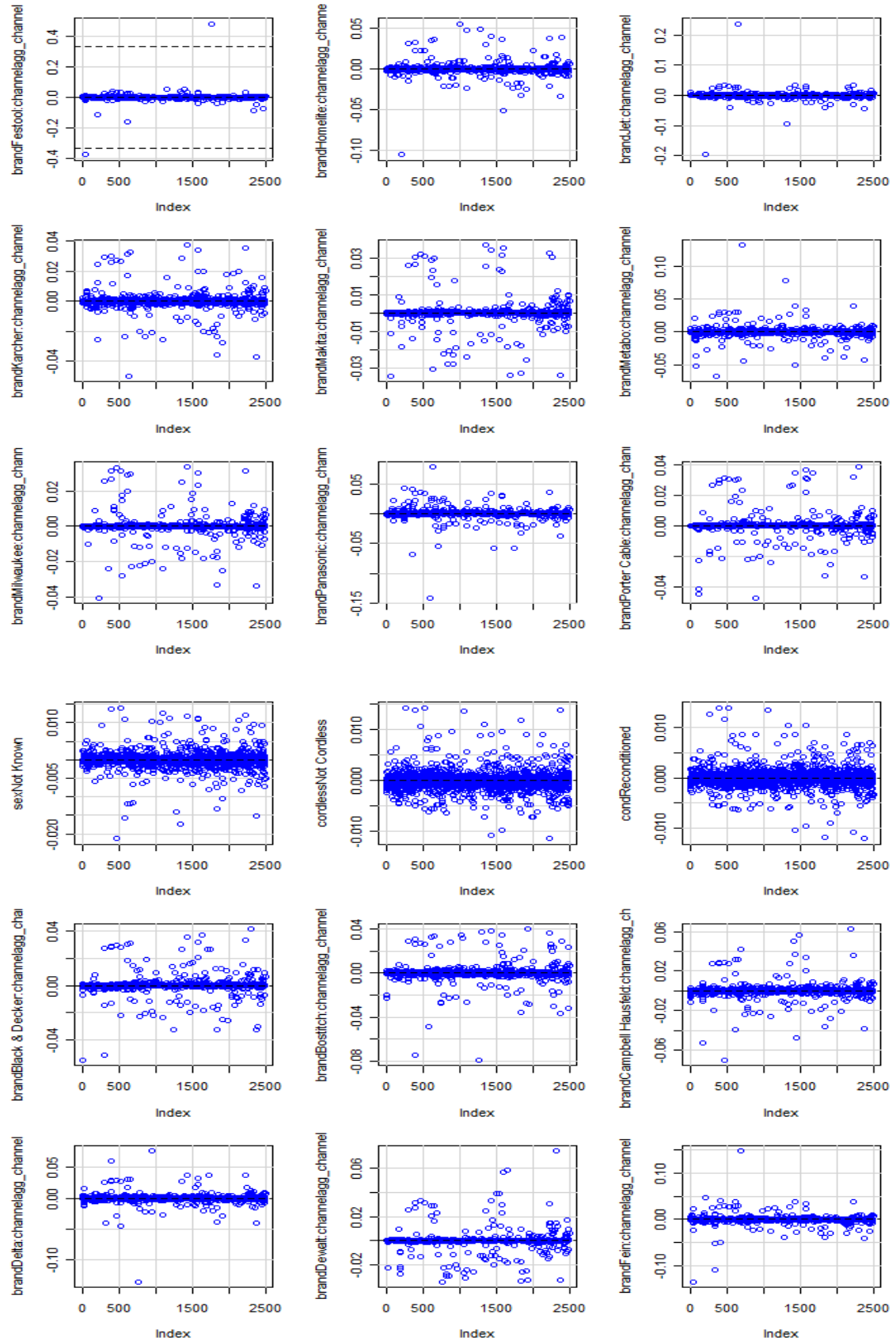
1-C.3: Univariate standardized deviance residual boxplots (Channel, Cordless, and Condition)

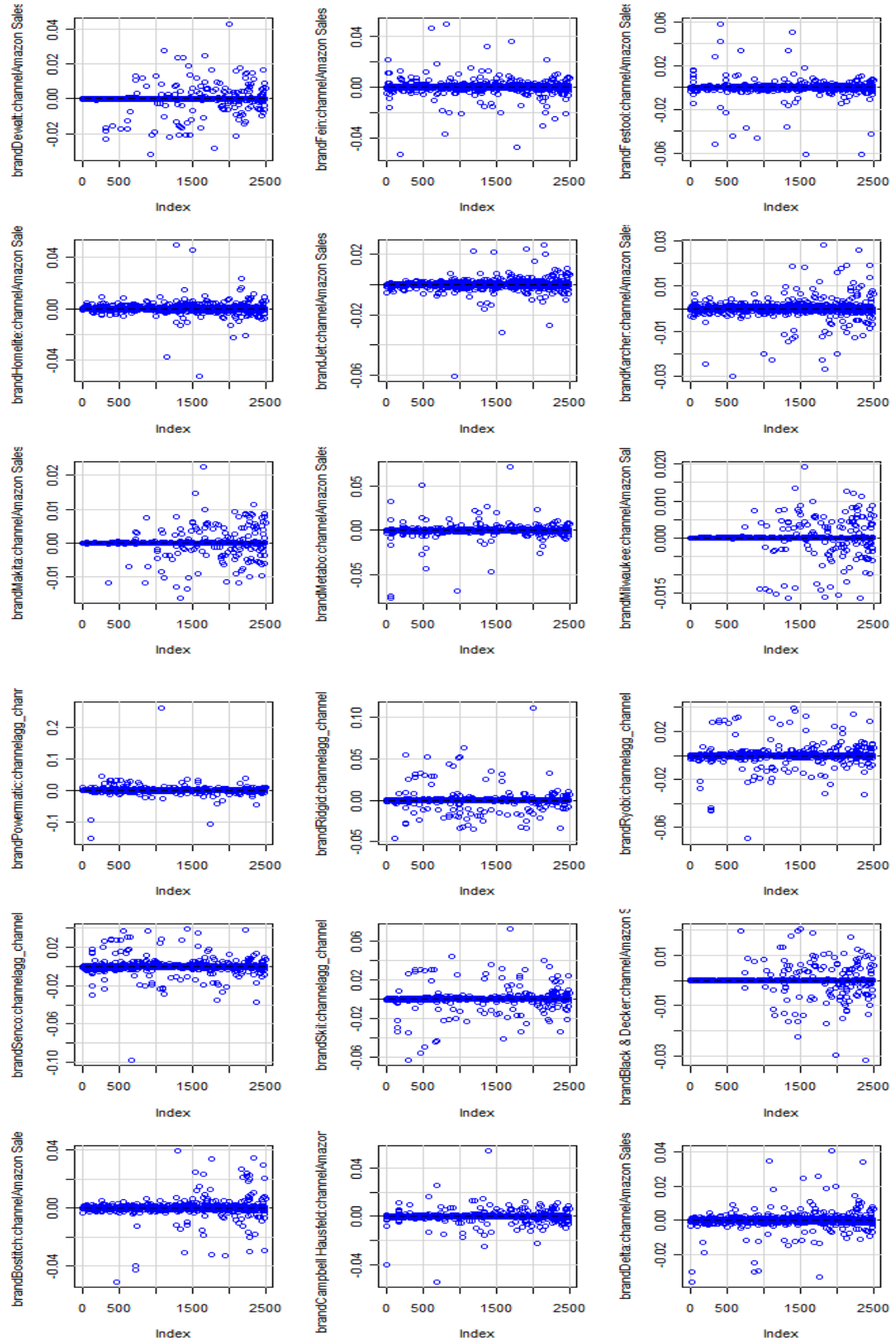


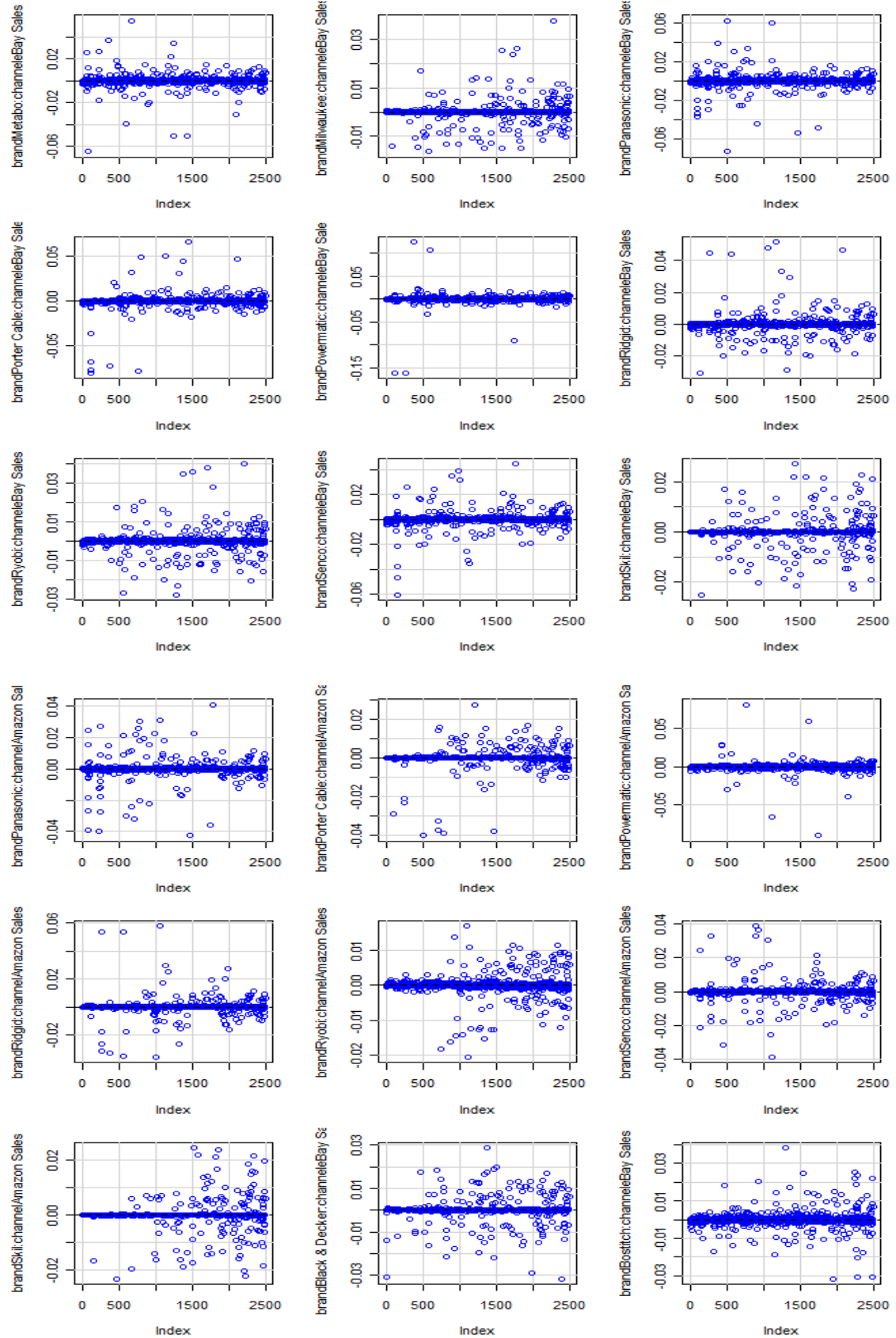
1-C.4: DF Beta Plots

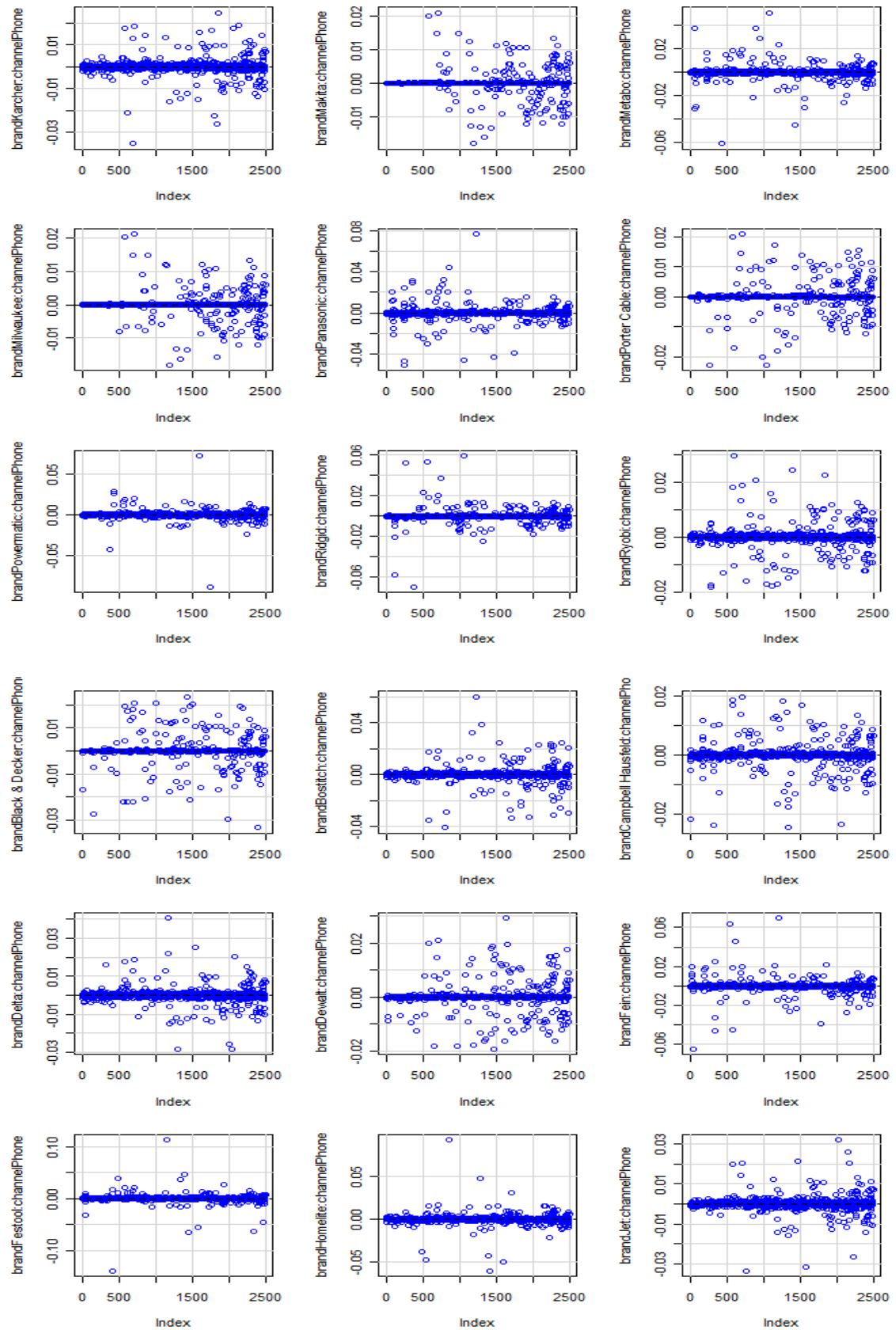


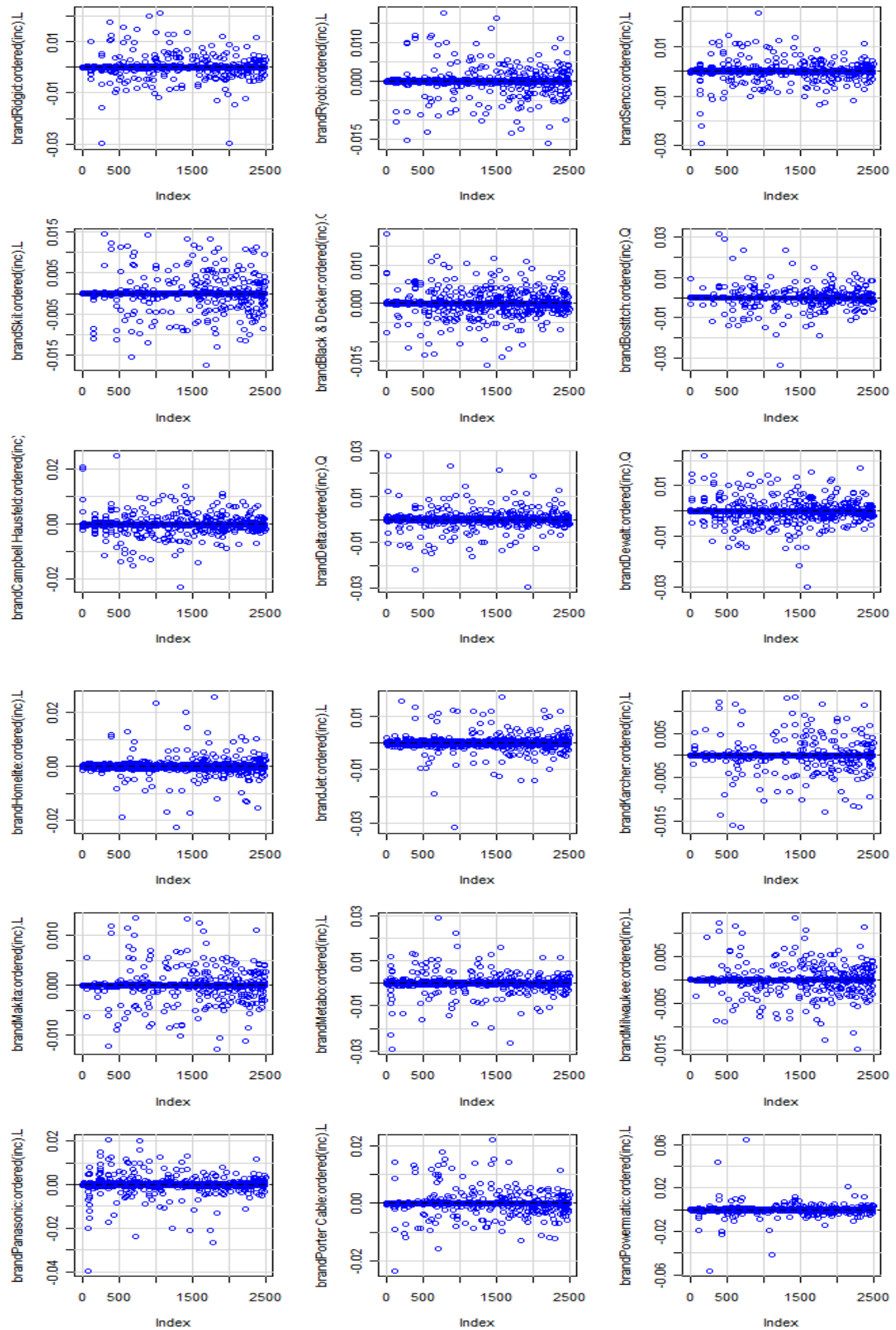


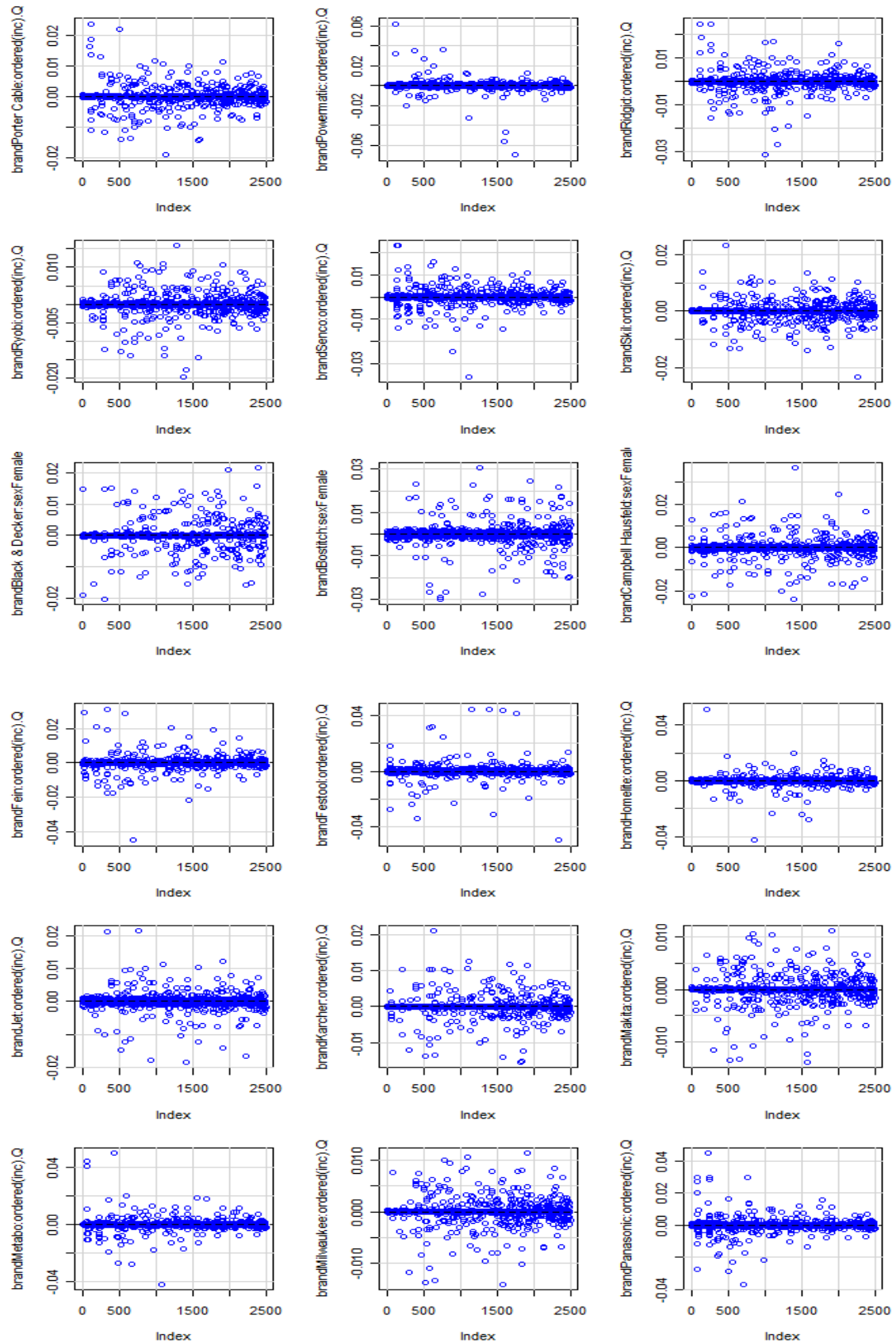


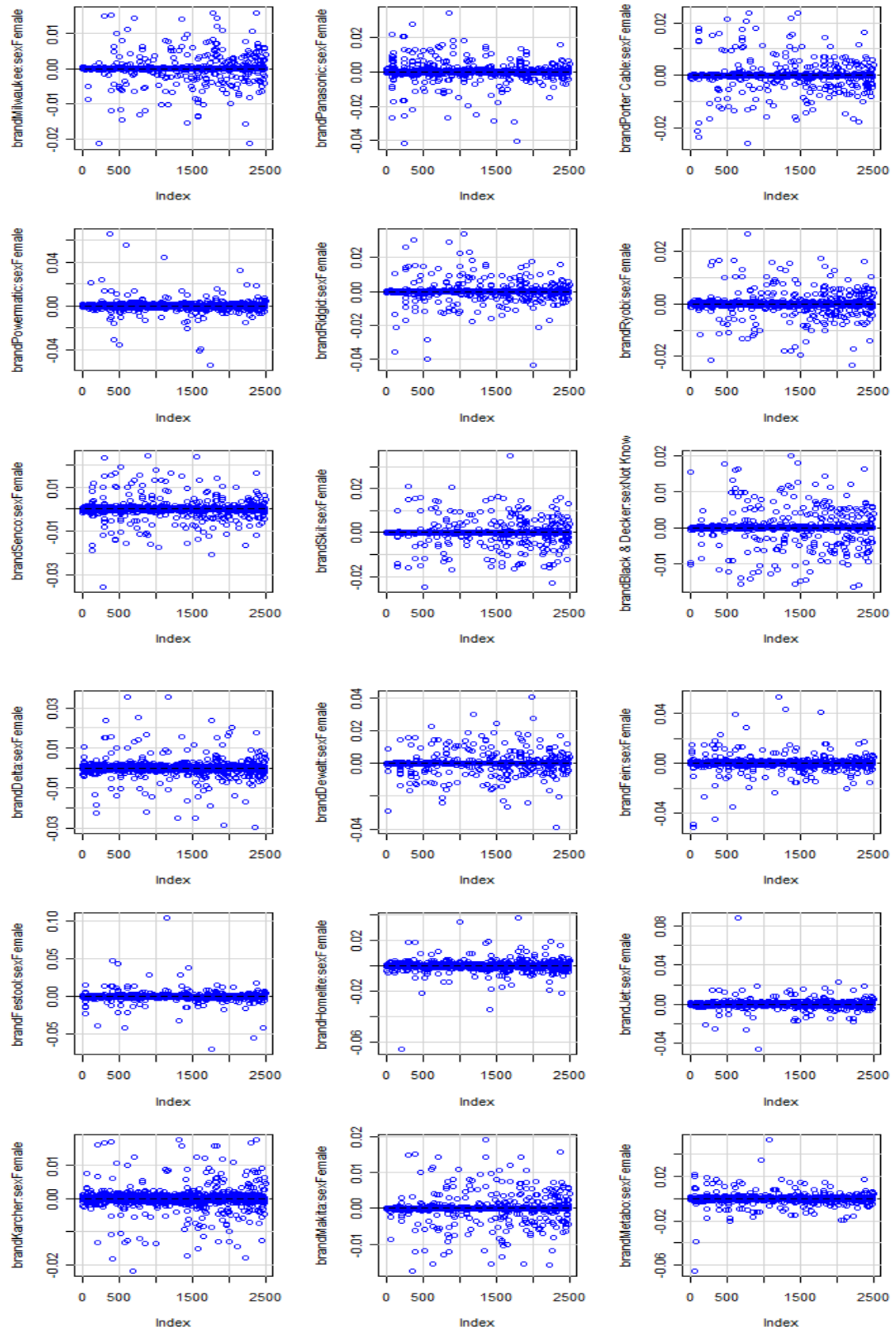


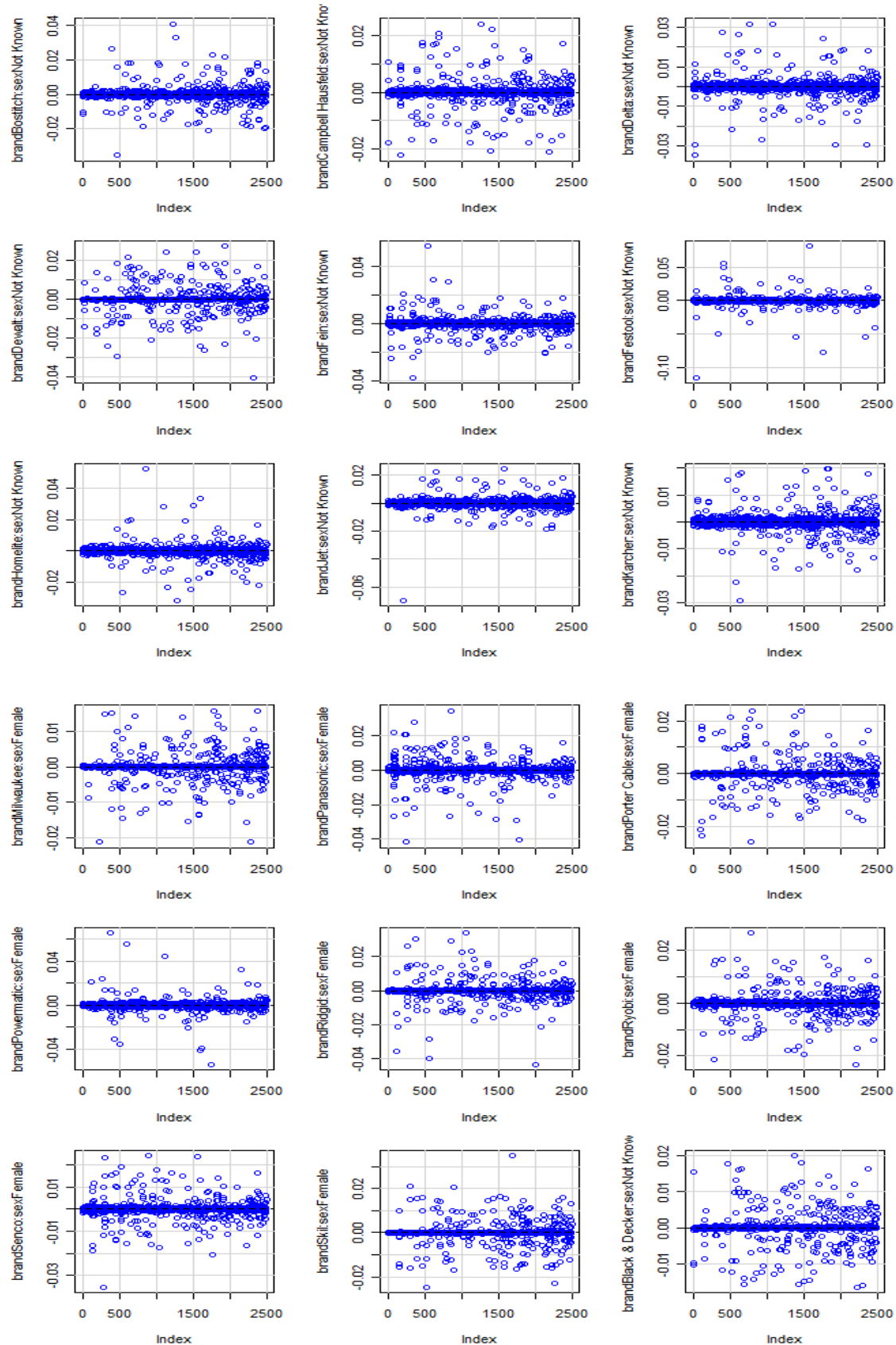


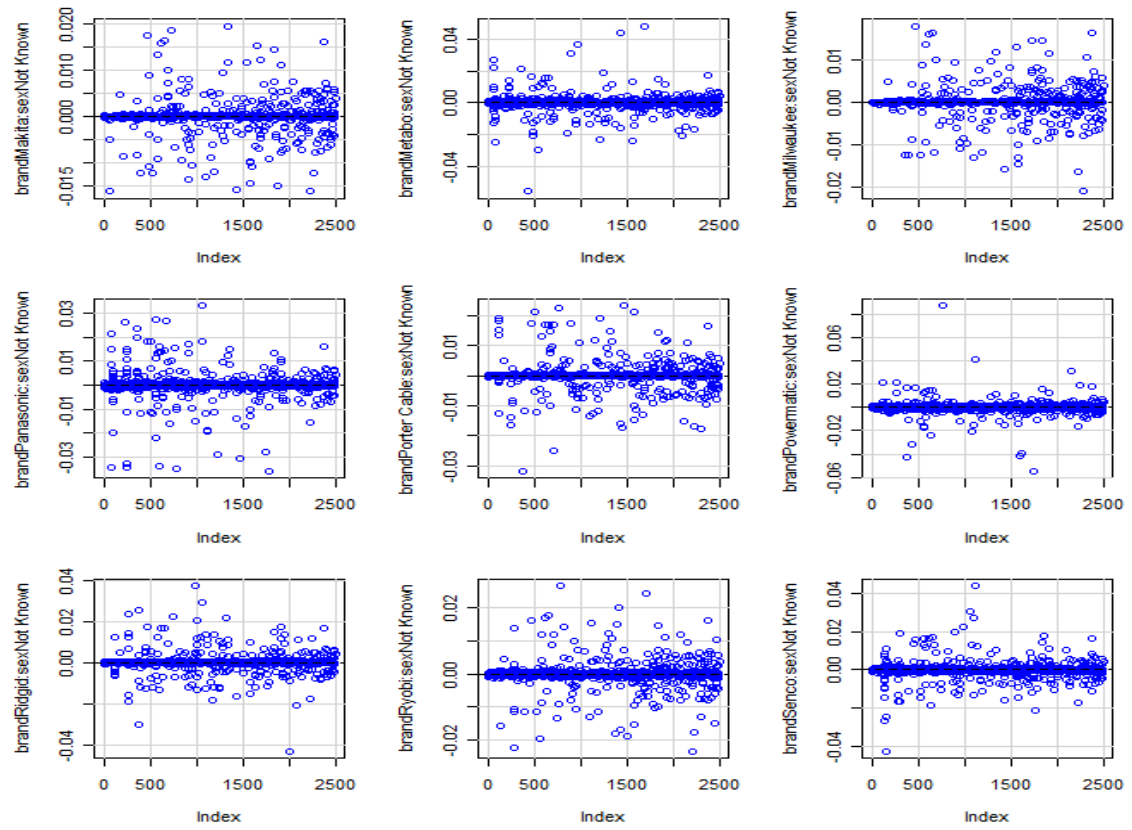












Appendix 2

2-A: ANOVA Output

```
> anova(full_mod_nb_anova,full_mod_nbadd, test='Chisq');  
Likelihood ratio tests of Negative Binomial Models
```

Response: freq

Model

1 brand + channel + sex + cordless + ordered(inc) + cond

2 brand:channel + brand:ordered(inc) + brand:sex + brand:cordless + brand:cond + channel:ordered(inc) + channel:sex + channel:cordless + channel:cond + ordered(inc):sex + ordered(inc):cond + sex:cond + cordless:cond

| | theta | Resid. df | 2 x log-lik. | Test | df | LR stat. | Pr(Chi) |
|---|----------|-----------|--------------|--------|-----|----------|---------|
| 1 | 1.184505 | 2459 | -25860.42 | | | | |
| 2 | 6.190681 | 2234 | -22113.20 | 1 vs 2 | 225 | 3747.22 | 0 |

```
> anova(full_mod_nb_anova,full_mod_nbadd);  
Likelihood ratio tests of Negative Binomial Models
```

Response: freq

Model

1 brand + channel + sex + cordless + ordered(inc) + cond

2 brand:channel + brand:ordered(inc) + brand:sex + brand:cordless + brand:cond + channel:ordered(inc) + channel:sex + channel:cordless + channel:cond + ordered(inc):sex + ordered(inc):cond + sex:cond + cordless:cond

| | theta | Resid. df | 2 x log-lik. | Test | df | LR stat. | Pr(Chi) |
|---|----------|-----------|--------------|--------|-----|----------|---------|
| 1 | 1.184505 | 2459 | -25860.42 | | | | |
| 2 | 6.190681 | 2234 | -22113.20 | 1 vs 2 | 225 | 3747.22 | 0 |

2-B.1: Summary() Output glm.nb

```
> summary(full_mod_nb_sw)#, correlation=T);
```

Call:

```
glm.nb(formula = freq ~ brand:channel + brand:ordered(inc) + brand:sex + brand:cordless + brand:cond + channel:ordered(inc) + channel:sex + channel:cordless + channel:cond + ordered(inc):sex + ordered(inc):cond + sex:cordless + sex:cond + cordless:cond, init.theta = 6.2085656, link = log)
```

Deviance Residuals:

| Min | 1Q | Median | 3Q | Max |
|----------|----------|----------|---------|---------|
| -5.25918 | -0.67050 | -0.09786 | 0.50318 | 4.54447 |

Coefficients: (9 not defined because of singularities)

| | Estimate | Std. Error | z value | Pr(> z) | |
|---|-----------|------------|---------|----------|-----|
| (Intercept) | 4.432857 | 0.107332 | 41.3 | < 2e-16 | *** |
| brandBosch:channelBranded Web | 2.635217 | 0.146345 | 18.007 | < 2e-16 | *** |
| brandBlack & Decker:channelBranded Web | 1.128783 | 0.148723 | 7.59 | 3.20E-14 | *** |
| brandBostitch:channelBranded Web | 2.648012 | 0.166737 | 15.881 | < 2e-16 | *** |
| brandCampbell Hausfeld:channelBranded Web | -0.677923 | 0.159605 | -4.248 | 2.16E-05 | *** |
| brandDelta:channelBranded Web | 3.205807 | 0.177074 | 18.104 | < 2e-16 | *** |
| brandDewalt:channelBranded Web | 2.208452 | 0.147958 | 14.926 | < 2e-16 | *** |
| brandFein:channelBranded Web | -2.501873 | 0.241357 | -10.366 | < 2e-16 | *** |
| brandFestool:channelBranded Web | -1.454804 | 0.21209 | -6.859 | 6.92E-12 | *** |
| brandHomelite:channelBranded Web | -3.753082 | 0.457301 | -8.207 | 2.27E-16 | *** |
| brandJet:channelBranded Web | 2.667954 | 0.19932 | 13.385 | < 2e-16 | *** |

| | | | | | |
|--|-----------|----------|---------|----------|-----|
| brandKarcher:channelBranded Web | -2.305625 | 0.368168 | -6.262 | 3.79E-10 | *** |
| brandMakita:channelBranded Web | 2.093061 | 0.147577 | 14.183 | < 2e-16 | *** |
| brandMetabo:channelBranded Web | -1.795951 | 0.212148 | -8.466 | < 2e-16 | *** |
| brandMilwaukee:channelBranded Web | 2.922548 | 0.14676 | 19.914 | < 2e-16 | *** |
| brandPanasonic:channelBranded Web | -0.381515 | 0.172934 | -2.206 | 0.027375 | * |
| brandPorter Cable:channelBranded Web | 1.768873 | 0.149135 | 11.861 | < 2e-16 | *** |
| brandPowermatic:channelBranded Web | 0.696888 | 0.21437 | 3.251 | 0.001151 | ** |
| brandRidgid:channelBranded Web | 0.5894 | 0.162354 | 3.63 | 0.000283 | *** |
| brandRyobi:channelBranded Web | -1.140508 | 0.186016 | -6.131 | 8.72E-10 | *** |
| brandSenco:channelBranded Web | -1.882343 | 0.179182 | -10.505 | < 2e-16 | *** |
| brandSkil:channelBranded Web | 1.729816 | 0.115214 | 15.014 | < 2e-16 | *** |
| brandBosch:channelagg_channel | -0.6433 | 0.155363 | -4.141 | 3.46E-05 | *** |
| brandBlack & Decker:channelagg_channel | -1.487047 | 0.176111 | -8.444 | < 2e-16 | *** |
| brandBostitch:channelagg_channel | -0.192839 | 0.196026 | -0.984 | 0.325242 | |
| brandCampbell Hausfeld:channelagg_channel | -3.835916 | 0.207256 | -18.508 | < 2e-16 | *** |
| brandDelta:channelagg_channel | -0.610659 | 0.223329 | -2.734 | 0.00625 | ** |
| brandDewalt:channelagg_channel | -0.28455 | 0.154963 | -1.836 | 0.066321 | . |
| brandFein:channelagg_channel | -5.981976 | 0.318749 | -18.767 | < 2e-16 | *** |
| brandFestool:channelagg_channel | -4.860816 | 0.351205 | -13.84 | < 2e-16 | *** |
| brandHomelite:channelagg_channel | -5.795182 | 0.510909 | -11.343 | < 2e-16 | *** |
| brandJet:channelagg_channel | -1.220208 | 0.281044 | -4.342 | 1.41E-05 | *** |
| brandKarcher:channelagg_channel | -4.754445 | 0.36069 | -13.182 | < 2e-16 | *** |
| brandMakita:channelagg_channel | -2.010895 | 0.165379 | -12.159 | < 2e-16 | *** |
| brandMetabo:channelagg_channel | -5.37193 | 0.308871 | -17.392 | < 2e-16 | *** |
| brandMilwaukee:channelagg_channel | -0.748139 | 0.1577 | -4.744 | 2.09E-06 | *** |
| brandPanasonic:channelagg_channel | -3.11118 | 0.246434 | -12.625 | < 2e-16 | *** |
| brandPorter Cable:channelagg_channel | -1.304034 | 0.165159 | -7.896 | 2.89E-15 | *** |
| brandPowermatic:channelagg_channel | -2.348149 | 0.361916 | -6.488 | 8.69E-11 | *** |
| brandRidgid:channelagg_channel | -1.762354 | 0.170202 | -10.354 | < 2e-16 | *** |
| brandRyobi:channelagg_channel | -3.889189 | 0.205408 | -18.934 | < 2e-16 | *** |
| brandSenco:channelagg_channel | -4.728253 | 0.22744 | -20.789 | < 2e-16 | *** |
| brandSkil:channelagg_channel | -1.813097 | 0.136394 | -13.293 | < 2e-16 | *** |
| brandBosch:channelAmazon Sales | 0.563851 | 0.147886 | 3.813 | 0.000137 | *** |
| brandBlack & Decker:channelAmazon Sales | 0.364217 | 0.149598 | 2.435 | 0.014907 | * |
| brandBostitch:channelAmazon Sales | 0.753706 | 0.179537 | 4.198 | 2.69E-05 | *** |
| brandCampbell Hausfeld:channelAmazon Sales | -2.623263 | 0.173423 | -15.126 | < 2e-16 | *** |
| brandDelta:channelAmazon Sales | 0.993417 | 0.189456 | 5.244 | 1.58E-07 | *** |
| brandDewalt:channelAmazon Sales | -0.286929 | 0.151174 | -1.898 | 0.057695 | . |
| brandFein:channelAmazon Sales | -4.294798 | 0.278041 | -15.447 | < 2e-16 | *** |
| brandFestool:channelAmazon Sales | -3.804347 | 0.245885 | -15.472 | < 2e-16 | *** |
| brandHomelite:channelAmazon Sales | -5.474585 | 0.505028 | -10.84 | < 2e-16 | *** |
| brandJet:channelAmazon Sales | 1.373987 | 0.21011 | 6.539 | 6.18E-11 | *** |
| brandKarcher:channelAmazon Sales | -3.816569 | 0.351462 | -10.859 | < 2e-16 | *** |

| | | | | | |
|--|-----------|----------|---------|----------|-----|
| brandMakita:channelAmazon Sales | -0.347506 | 0.150408 | -2.31 | 0.020865 | * |
| brandMetabo:channelAmazon Sales | -3.986796 | 0.238494 | -16.717 | < 2e-16 | *** |
| brandMilwaukee:channelAmazon Sales | 0.863782 | 0.148198 | 5.829 | 5.59E-09 | *** |
| brandPanasonic:channelAmazon Sales | -1.363336 | 0.177231 | -7.692 | 1.44E-14 | *** |
| brandPorter Cable:channelAmazon Sales | -0.957463 | 0.154248 | -6.207 | 5.39E-10 | *** |
| brandPowermatic:channelAmazon Sales | 0.413238 | 0.223056 | 1.853 | 0.063937 | . |
| brandRidgid:channelAmazon Sales | -1.245704 | 0.161492 | -7.714 | 1.22E-14 | *** |
| brandRyobi:channelAmazon Sales | -2.545099 | 0.187694 | -13.56 | < 2e-16 | *** |
| brandSenco:channelAmazon Sales | -3.41259 | 0.186328 | -18.315 | < 2e-16 | *** |
| brandSkil:channelAmazon Sales | -0.451212 | 0.117916 | -3.827 | 0.00013 | *** |
| brandBosch:channeleBay Sales | -1.246932 | 0.15442 | -8.075 | 6.75E-16 | *** |
| brandBlack & Decker:channeleBay Sales | -0.906397 | 0.154117 | -5.881 | 4.07E-09 | *** |
| brandBostitch:channeleBay Sales | -0.692648 | 0.188835 | -3.668 | 0.000244 | *** |
| brandCampbell Hausfeld:channeleBay Sales | -3.750642 | 0.187925 | -19.958 | < 2e-16 | *** |
| brandDelta:channeleBay Sales | -2.6861 | 0.294242 | -9.129 | < 2e-16 | *** |
| brandDewalt:channeleBay Sales | -1.355404 | 0.160849 | -8.427 | < 2e-16 | *** |
| brandFein:channeleBay Sales | -4.92317 | 0.283299 | -17.378 | < 2e-16 | *** |
| brandFestool:channeleBay Sales | -6.737029 | 0.371196 | -18.15 | < 2e-16 | *** |
| brandHomelite:channeleBay Sales | -5.643465 | 0.506868 | -11.134 | < 2e-16 | *** |
| brandJet:channeleBay Sales | 0.574438 | 0.21659 | 2.652 | 0.007997 | ** |
| brandKarcher:channeleBay Sales | -5.166433 | 0.365895 | -14.12 | < 2e-16 | *** |
| brandMakita:channeleBay Sales | -1.452581 | 0.156272 | -9.295 | < 2e-16 | *** |
| brandMetabo:channeleBay Sales | -4.773583 | 0.255543 | -18.68 | < 2e-16 | *** |
| brandMilwaukee:channeleBay Sales | -0.148771 | 0.151928 | -0.979 | 0.327472 | |
| brandPanasonic:channeleBay Sales | -3.014063 | 0.213874 | -14.093 | < 2e-16 | *** |
| brandPorter Cable:channeleBay Sales | -2.485056 | 0.176037 | -14.117 | < 2e-16 | *** |
| brandPowermatic:channeleBay Sales | -2.096023 | 0.28625 | -7.322 | 2.44E-13 | *** |
| brandRidgid:channeleBay Sales | -1.753887 | 0.179766 | -9.756 | < 2e-16 | *** |
| brandRyobi:channeleBay Sales | -3.305267 | 0.192492 | -17.171 | < 2e-16 | *** |
| brandSenco:channeleBay Sales | -4.608021 | 0.207173 | -22.242 | < 2e-16 | *** |
| brandSkil:channeleBay Sales | -1.56206 | 0.124198 | -12.577 | < 2e-16 | *** |
| brandBosch:channelPhone | 1.303975 | 0.135496 | 9.624 | < 2e-16 | *** |
| brandBlack & Decker:channelPhone | -0.798262 | 0.142367 | -5.607 | 2.06E-08 | *** |
| brandBostitch:channelPhone | 1.215974 | 0.166951 | 7.283 | 3.25E-13 | *** |
| brandCampbell Hausfeld:channelPhone | -2.383234 | 0.161796 | -14.73 | < 2e-16 | *** |
| brandDelta:channelPhone | 2.188218 | 0.176555 | 12.394 | < 2e-16 | *** |
| brandDewalt:channelPhone | 0.350946 | 0.139786 | 2.511 | 0.012053 | * |
| brandFein:channelPhone | -4.161368 | 0.259255 | -16.051 | < 2e-16 | *** |
| brandFestool:channelPhone | -2.75095 | 0.239048 | -11.508 | < 2e-16 | *** |
| brandHomelite:channelPhone | -5.496725 | 0.504083 | -10.904 | < 2e-16 | *** |
| brandJet:channelPhone | 1.753505 | 0.201914 | 8.684 | < 2e-16 | *** |
| brandKarcher:channelPhone | -4.001815 | 0.365138 | -10.96 | < 2e-16 | *** |
| brandMakita:channelPhone | 0.698385 | 0.137364 | 5.084 | 3.69E-07 | *** |

| | | | | | |
|---------------------------------------|-----------|----------|---------|----------|-----|
| brandMetabo:channelPhone | -2.695586 | 0.216441 | -12.454 | < 2e-16 | *** |
| brandMilwaukee:channelPhone | 1.407792 | 0.136345 | 10.325 | < 2e-16 | *** |
| brandPanasonic:channelPhone | -1.685697 | 0.182293 | -9.247 | < 2e-16 | *** |
| brandPorter Cable:channelPhone | 0.35442 | 0.139817 | 2.535 | 0.011248 | * |
| brandPowermatic:channelPhone | 0.55012 | 0.216683 | 2.539 | 0.011123 | * |
| brandRidgid:channelPhone | -1.171874 | 0.159793 | -7.334 | 2.24E-13 | *** |
| brandRyobi:channelPhone | -3.25351 | 0.184479 | -17.636 | < 2e-16 | *** |
| brandSenco:channelPhone | -3.050432 | 0.178816 | -17.059 | < 2e-16 | *** |
| brandSkil:channelPhone | NA | NA | NA | NA | |
| brandBosch:ordered(inc).L | -1.673347 | 0.067731 | -24.706 | < 2e-16 | *** |
| brandBlack & Decker:ordered(inc).L | -1.618651 | 0.070181 | -23.064 | < 2e-16 | *** |
| brandBostitch:ordered(inc).L | -1.589937 | 0.088102 | -18.047 | < 2e-16 | *** |
| brandCampbell Hausfeld:ordered(inc).L | -1.52363 | 0.079402 | -19.189 | < 2e-16 | *** |
| brandDelta:ordered(inc).L | -1.537384 | 0.104257 | -14.746 | < 2e-16 | *** |
| brandDewalt:ordered(inc).L | -1.596259 | 0.069525 | -22.96 | < 2e-16 | *** |
| brandFein:ordered(inc).L | -1.703894 | 0.103801 | -16.415 | < 2e-16 | *** |
| brandFestool:ordered(inc).L | -1.708904 | 0.134159 | -12.738 | < 2e-16 | *** |
| brandHomelite:ordered(inc).L | -1.545327 | 0.118253 | -13.068 | < 2e-16 | *** |
| brandJet:ordered(inc).L | -1.573776 | 0.121549 | -12.948 | < 2e-16 | *** |
| brandKarcher:ordered(inc).L | -1.782999 | 0.088765 | -20.087 | < 2e-16 | *** |
| brandMakita:ordered(inc).L | -1.606217 | 0.069339 | -23.165 | < 2e-16 | *** |
| brandMetabo:ordered(inc).L | -1.401723 | 0.104498 | -13.414 | < 2e-16 | *** |
| brandMilwaukee:ordered(inc).L | -1.622123 | 0.067958 | -23.869 | < 2e-16 | *** |
| brandPanasonic:ordered(inc).L | -1.542533 | 0.109488 | -14.089 | < 2e-16 | *** |
| brandPorter Cable:ordered(inc).L | -1.560781 | 0.071434 | -21.849 | < 2e-16 | *** |
| brandPowermatic:ordered(inc).L | -1.833636 | 0.147662 | -12.418 | < 2e-16 | *** |
| brandRidgid:ordered(inc).L | -1.608955 | 0.076149 | -21.129 | < 2e-16 | *** |
| brandRyobi:ordered(inc).L | -1.606569 | 0.078156 | -20.556 | < 2e-16 | *** |
| brandSenco:ordered(inc).L | -1.585782 | 0.086696 | -18.291 | < 2e-16 | *** |
| brandSkil:ordered(inc).L | -1.541812 | 0.0688 | -22.41 | < 2e-16 | *** |
| brandBosch:ordered(inc).Q | 0.740878 | 0.069922 | 10.596 | < 2e-16 | *** |
| brandBlack & Decker:ordered(inc).Q | 0.648063 | 0.072842 | 8.897 | < 2e-16 | *** |
| brandBostitch:ordered(inc).Q | 0.869481 | 0.091829 | 9.468 | < 2e-16 | *** |
| brandCampbell Hausfeld:ordered(inc).Q | 0.722781 | 0.083662 | 8.639 | < 2e-16 | *** |
| brandDelta:ordered(inc).Q | 0.825013 | 0.109594 | 7.528 | 5.16E-14 | *** |
| brandDewalt:ordered(inc).Q | 1.021213 | 0.073997 | 13.801 | < 2e-16 | *** |
| brandFein:ordered(inc).Q | 0.596464 | 0.108313 | 5.507 | 3.65E-08 | *** |
| brandFestool:ordered(inc).Q | 0.430225 | 0.130448 | 3.298 | 0.000974 | *** |
| brandHomelite:ordered(inc).Q | 0.772256 | 0.121452 | 6.359 | 2.04E-10 | *** |
| brandJet:ordered(inc).Q | 1.00886 | 0.127772 | 7.896 | 2.88E-15 | *** |
| brandKarcher:ordered(inc).Q | 0.373376 | 0.090158 | 4.141 | 3.45E-05 | *** |
| brandMakita:ordered(inc).Q | 0.821378 | 0.072009 | 11.407 | < 2e-16 | *** |
| brandMetabo:ordered(inc).Q | 0.839865 | 0.111621 | 7.524 | 5.30E-14 | *** |

| | | | | | |
|-------------------------------------|-----------|----------|---------|----------|-----|
| brandMilwaukee:ordered(inc).Q | 1.000424 | 0.070868 | 14.117 | < 2e-16 | *** |
| brandPanasonic:ordered(inc).Q | 0.722226 | 0.117768 | 6.133 | 8.65E-10 | *** |
| brandPorter Cable:ordered(inc).Q | 0.855129 | 0.074559 | 11.469 | < 2e-16 | *** |
| brandPowermatic:ordered(inc).Q | 0.864948 | 0.158501 | 5.457 | 4.84E-08 | *** |
| brandRidgid:ordered(inc).Q | 0.870583 | 0.083485 | 10.428 | < 2e-16 | *** |
| brandRyobi:ordered(inc).Q | 0.736987 | 0.0821 | 8.977 | < 2e-16 | *** |
| brandSenco:ordered(inc).Q | 1.00953 | 0.096044 | 10.511 | < 2e-16 | *** |
| brandSkil:ordered(inc).Q | 0.880167 | 0.072314 | 12.171 | < 2e-16 | *** |
| brandBosch:sexFemale | -1.718678 | 0.094903 | -18.11 | < 2e-16 | *** |
| brandBlack & Decker:sexFemale | -0.725286 | 0.097282 | -7.455 | 8.95E-14 | *** |
| brandBostitch:sexFemale | -1.483729 | 0.132222 | -11.222 | < 2e-16 | *** |
| brandCampbell Hausfeld:sexFemale | -1.325482 | 0.113983 | -11.629 | < 2e-16 | *** |
| brandDelta:sexFemale | -1.906898 | 0.153194 | -12.448 | < 2e-16 | *** |
| brandDewalt:sexFemale | -1.586499 | 0.098245 | -16.148 | < 2e-16 | *** |
| brandFein:sexFemale | -1.353213 | 0.14797 | -9.145 | < 2e-16 | *** |
| brandFestool:sexFemale | -2.031775 | 0.182081 | -11.159 | < 2e-16 | *** |
| brandHomelite:sexFemale | -1.383606 | 0.173193 | -7.989 | 1.36E-15 | *** |
| brandJet:sexFemale | -2.094242 | 0.179719 | -11.653 | < 2e-16 | *** |
| brandKarcher:sexFemale | -1.265349 | 0.130176 | -9.72 | < 2e-16 | *** |
| brandMakita:sexFemale | -1.552349 | 0.097601 | -15.905 | < 2e-16 | *** |
| brandMetabo:sexFemale | -1.754253 | 0.153376 | -11.438 | < 2e-16 | *** |
| brandMilwaukee:sexFemale | -1.784357 | 0.095417 | -18.701 | < 2e-16 | *** |
| brandPanasonic:sexFemale | -1.779795 | 0.151046 | -11.783 | < 2e-16 | *** |
| brandPorter Cable:sexFemale | -1.592111 | 0.101385 | -15.704 | < 2e-16 | *** |
| brandPowermatic:sexFemale | -2.54397 | 0.219208 | -11.605 | < 2e-16 | *** |
| brandRidgid:sexFemale | -1.725779 | 0.109546 | -15.754 | < 2e-16 | *** |
| brandRyobi:sexFemale | -1.350784 | 0.11233 | -12.025 | < 2e-16 | *** |
| brandSenco:sexFemale | -1.694791 | 0.126703 | -13.376 | < 2e-16 | *** |
| brandSkil:sexFemale | -1.148296 | 0.096478 | -11.902 | < 2e-16 | *** |
| brandBosch:sexNot Known | -1.954637 | 0.094711 | -20.638 | < 2e-16 | *** |
| brandBlack & Decker:sexNot Known | -1.756109 | 0.099595 | -17.632 | < 2e-16 | *** |
| brandBostitch:sexNot Known | -1.961321 | 0.131862 | -14.874 | < 2e-16 | *** |
| brandCampbell Hausfeld:sexNot Known | -1.960952 | 0.11756 | -16.68 | < 2e-16 | *** |
| brandDelta:sexNot Known | -2.168091 | 0.153357 | -14.138 | < 2e-16 | *** |
| brandDewalt:sexNot Known | -2.042052 | 0.098971 | -20.633 | < 2e-16 | *** |
| brandFein:sexNot Known | -1.959306 | 0.151473 | -12.935 | < 2e-16 | *** |
| brandFestool:sexNot Known | -1.862089 | 0.178033 | -10.459 | < 2e-16 | *** |
| brandHomelite:sexNot Known | -2.007114 | 0.172334 | -11.647 | < 2e-16 | *** |
| brandJet:sexNot Known | -2.093695 | 0.177998 | -11.762 | < 2e-16 | *** |
| brandKarcher:sexNot Known | -1.900955 | 0.132457 | -14.351 | < 2e-16 | *** |
| brandMakita:sexNot Known | -1.859378 | 0.097515 | -19.068 | < 2e-16 | *** |
| brandMetabo:sexNot Known | -1.781285 | 0.146199 | -12.184 | < 2e-16 | *** |
| brandMilwaukee:sexNot Known | -2.130642 | 0.095391 | -22.336 | < 2e-16 | *** |

| | | | | | |
|---|-----------|----------|---------|----------|-----|
| brandPanasonic:sexNot Known | -1.695425 | 0.144687 | -11.718 | < 2e-16 | *** |
| brandPorter Cable:sexNot Known | -2.176909 | 0.101421 | -21.464 | < 2e-16 | *** |
| brandPowermatic:sexNot Known | -2.394182 | 0.212211 | -11.282 | < 2e-16 | *** |
| brandRidgid:sexNot Known | -2.109243 | 0.110705 | -19.053 | < 2e-16 | *** |
| brandRyobi:sexNot Known | -1.923301 | 0.113517 | -16.943 | < 2e-16 | *** |
| brandSenco:sexNot Known | -2.114309 | 0.129541 | -16.322 | < 2e-16 | *** |
| brandSkil:sexNot Known | -2.054337 | 0.098765 | -20.8 | < 2e-16 | *** |
| brandBosch:cordlessNot Cordless | 2.051494 | 0.083252 | 24.642 | < 2e-16 | *** |
| brandBlack & Decker:cordlessNot Cordless | 0.665125 | 0.086184 | 7.718 | 1.19E-14 | *** |
| brandBostitch:cordlessNot Cordless | NA | NA | NA | NA | |
| brandCampbell Hausfeld:cordlessNot Cordless | 3.616180 | 0.109958 | 32.887 | < 2e-16 | *** |
| brandDelta:cordlessNot Cordless | NA | NA | NA | NA | |
| brandDewalt:cordlessNot Cordless | 1.041433 | 0.085541 | 12.175 | < 2e-16 | *** |
| brandFein:cordlessNot Cordless | 4.723497 | 0.225385 | 20.957 | < 2e-16 | *** |
| brandFestool:cordlessNot Cordless | 3.887669 | 0.190103 | 20.45 | < 2e-16 | *** |
| brandHomelite:cordlessNot Cordless | NA | NA | NA | NA | |
| brandJet:cordlessNot Cordless | NA | NA | NA | NA | |
| brandKarcher:cordlessNot Cordless | 4.820485 | 0.344299 | 14.001 | < 2e-16 | *** |
| brandMakita:cordlessNot Cordless | 1.522998 | 0.08492 | 17.934 | < 2e-16 | *** |
| brandMetabo:cordlessNot Cordless | 3.793197 | 0.184512 | 20.558 | < 2e-16 | *** |
| brandMilwaukee:cordlessNot Cordless | 0.816621 | 0.083539 | 9.775 | < 2e-16 | *** |
| brandPanasonic:cordlessNot Cordless | -0.309751 | 0.119953 | -2.582 | 0.009815 | ** |
| brandPorter Cable:cordlessNot Cordless | 1.926449 | 0.087813 | 21.938 | < 2e-16 | *** |
| brandPowermatic:cordlessNot Cordless | NA | NA | NA | NA | |
| brandRidgid:cordlessNot Cordless | 0.898367 | 0.096813 | 9.279 | < 2e-16 | *** |
| brandRyobi:cordlessNot Cordless | 3.09552 | 0.113675 | 27.231 | < 2e-16 | *** |
| brandSenco:cordlessNot Cordless | 2.928078 | 0.119731 | 24.455 | < 2e-16 | *** |
| brandSkil:cordlessNot Cordless | 2.115117 | 0.08522 | 24.82 | < 2e-16 | *** |
| brandBosch:condReconditioned | 0.139801 | 0.08107 | 1.724 | 0.084627 | . |
| brandBlack & Decker:condReconditioned | 0.471074 | 0.084605 | 5.568 | 2.58E-08 | *** |
| brandBostitch:condReconditioned | 1.069913 | 0.111498 | 9.596 | < 2e-16 | *** |
| brandCampbell Hausfeld:condReconditioned | -0.155216 | 0.096793 | -1.604 | 0.108804 | |
| brandDelta:condReconditioned | -1.88717 | 0.129985 | -14.518 | < 2e-16 | *** |
| brandDewalt:condReconditioned | -0.485644 | 0.083756 | -5.798 | 6.70E-09 | *** |
| brandFein:condReconditioned | -1.838577 | 0.142652 | -12.889 | < 2e-16 | *** |
| brandFestool:condReconditioned | NA | NA | NA | NA | |
| brandHomelite:condReconditioned | 6.838807 | 0.472256 | 14.481 | < 2e-16 | *** |
| brandJet:condReconditioned | NA | NA | NA | NA | |
| brandKarcher:condReconditioned | 0.573701 | 0.111233 | 5.158 | 2.50E-07 | *** |
| brandMakita:condReconditioned | 0.353973 | 0.082873 | 4.271 | 1.94E-05 | *** |
| brandMetabo:condReconditioned | -1.880562 | 0.14054 | -13.381 | < 2e-16 | *** |
| brandMilwaukee:condReconditioned | -0.071068 | 0.081315 | -0.874 | 0.38213 | |
| brandPanasonic:condReconditioned | -1.173486 | 0.12152 | -9.657 | < 2e-16 | *** |

| | | | | | |
|--|-----------|----------|---------|----------|-----|
| brandPorter Cable:condReconditioned | 0.15128 | 0.086433 | 1.75 | 0.080074 | . |
| brandPowermatic:condReconditioned | NA | NA | NA | NA | |
| brandRidgid:condReconditioned | 0.774195 | 0.096189 | 8.049 | 8.37E-16 | *** |
| brandRyobi:condReconditioned | 2.226436 | 0.112645 | 19.765 | < 2e-16 | *** |
| brandSenco:condReconditioned | 0.893921 | 0.10874 | 8.221 | < 2e-16 | *** |
| brandSkil:condReconditioned | 0.370373 | 0.083126 | 4.456 | 8.37E-06 | *** |
| channelagg_channel:ordered(inc).L | 0.092042 | 0.053886 | 1.708 | 0.087621 | . |
| channelAmazon Sales:ordered(inc).L | -0.017592 | 0.046146 | -0.381 | 0.703036 | |
| channeleBay Sales:ordered(inc).L | 0.129572 | 0.049244 | 2.631 | 0.008507 | ** |
| channelPhone:ordered(inc).L | 0.106279 | 0.046907 | 2.266 | 0.023467 | * |
| channelagg_channel:ordered(inc).Q | -0.053706 | 0.058195 | -0.923 | 0.35608 | |
| channelAmazon Sales:ordered(inc).Q | -0.19494 | 0.047193 | -4.131 | 3.62E-05 | *** |
| channeleBay Sales:ordered(inc).Q | 0.396009 | 0.053313 | 7.428 | 1.10E-13 | *** |
| channelPhone:ordered(inc).Q | 0.146218 | 0.049367 | 2.962 | 0.003058 | ** |
| channelagg_channel:sexFemale | -0.556835 | 0.07842 | -7.101 | 1.24E-12 | *** |
| channelAmazon Sales:sexFemale | 0.56166 | 0.064658 | 8.687 | < 2e-16 | *** |
| channeleBay Sales:sexFemale | 0.194313 | 0.070406 | 2.76 | 0.005782 | ** |
| channelPhone:sexFemale | -0.038555 | 0.066267 | -0.582 | 0.560692 | |
| channelagg_channel:sexNot Known | 0.022173 | 0.075966 | 0.292 | 0.77038 | |
| channelAmazon Sales:sexNot Known | 0.509403 | 0.065217 | 7.811 | 5.68E-15 | *** |
| channeleBay Sales:sexNot Known | 0.434667 | 0.070499 | 6.166 | 7.02E-10 | *** |
| channelPhone:sexNot Known | -0.055844 | 0.067189 | -0.831 | 0.405888 | |
| channelagg_channel:cordlessNot Cordless | -0.616327 | 0.072686 | -8.479 | < 2e-16 | *** |
| channelAmazon Sales:cordlessNot Cordless | -0.061276 | 0.061071 | -1.003 | 0.31569 | |
| channeleBay Sales:cordlessNot Cordless | -0.021747 | 0.067328 | -0.323 | 0.74669 | |
| channelPhone:cordlessNot Cordless | 0.007024 | 0.063188 | 0.111 | 0.911483 | |
| channelagg_channel:condReconditioned | 1.410816 | 0.067245 | 20.98 | < 2e-16 | *** |
| channelAmazon Sales:condReconditioned | 0.945815 | 0.056689 | 16.684 | < 2e-16 | *** |
| channeleBay Sales:condReconditioned | 1.547992 | 0.061736 | 25.075 | < 2e-16 | *** |
| channelPhone:condReconditioned | -0.183443 | 0.057905 | -3.168 | 0.001535 | ** |
| ordered(inc).L:sexFemale | 0.169094 | 0.038132 | 4.434 | 9.23E-06 | *** |
| ordered(inc).Q:sexFemale | 0.20811 | 0.041151 | 5.057 | 4.25E-07 | *** |
| ordered(inc).L:sexNot Known | 0.074604 | 0.038732 | 1.926 | 0.054087 | . |
| ordered(inc).Q:sexNot Known | -0.040523 | 0.040553 | -0.999 | 0.317672 | |
| ordered(inc).L:condReconditioned | -0.015196 | 0.033502 | -0.454 | 0.650136 | |
| ordered(inc).Q:condReconditioned | 0.121143 | 0.0357 | 3.393 | 0.00069 | *** |
| sexFemale:cordlessNot Cordless | -0.148618 | 0.051521 | -2.885 | 0.003919 | ** |
| sexNot Known:cordlessNot Cordless | -0.097872 | 0.05199 | -1.882 | 0.059769 | . |
| sexFemale:condReconditioned | -0.48961 | 0.047601 | -10.286 | < 2e-16 | *** |
| sexNot Known:condReconditioned | -0.104432 | 0.047772 | -2.186 | 0.028812 | * |
| cordlessNot Cordless:condReconditioned | -0.472848 | 0.045883 | -10.305 | < 2e-16 | *** |

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

(Dispersion parameter for Negative Binomial(6.2086) family taken to be 1)

Null deviance: 60476.3 on 2489 degrees of freedom
Residual deviance: 2652.8 on 2232 degrees of freedom
AIC: 22622

Number of Fisher Scoring iterations: 1

Theta: 6.209
Std. Err.: 0.227
2 x log-likelihood: -22104.437

2-B.2: Summary() Output glm.poisson.disp

```
> summary(full_mod_disp_sw);
```

Call:

```
glm(formula = freq ~ brand * channel + brand * ordered(inc) + brand * sex + brand * cordless + brand * cond + channel * ordered(inc) + channel * sex + channel * cordless + channel * cond + ordered(inc) * sex + ordered(inc) * cond + sex * cordless + sex * cond + cordless * cond, family = poisson(), weights = disp.weights)
```

Deviance Residuals:

| Min | 1Q | Median | 3Q | Max |
|----------|----------|----------|---------|---------|
| -2.98942 | -0.61366 | -0.08906 | 0.48620 | 5.25353 |

Coefficients: (8 not defined because of singularities)

Estimate Std. Error z value Pr(>|z|)

| | | | | | |
|------------------------|-----------|----------|---------|----------|-----|
| (Intercept) | 7.06601 | 0.108821 | 64.933 | < 2e-16 | *** |
| brandBlack & Decker | -1.510262 | 0.143954 | -10.491 | < 2e-16 | *** |
| brandBostitch | -2.040964 | 0.167863 | -12.159 | < 2e-16 | *** |
| brandCampbell Hausfeld | -3.31416 | 0.155908 | -21.257 | < 2e-16 | *** |
| brandDelta | -1.48437 | 0.180155 | -8.239 | < 2e-16 | *** |
| brandDewalt | -0.423087 | 0.142839 | -2.962 | 0.003057 | ** |
| brandFein | -5.121874 | 0.244066 | -20.986 | < 2e-16 | *** |
| brandFestool | -4.081417 | 0.215702 | -18.922 | < 2e-16 | *** |
| brandHomelite | -8.440599 | 0.472688 | -17.857 | < 2e-16 | *** |
| brandJet | -2.018884 | 0.207304 | -9.739 | < 2e-16 | *** |
| brandKarcher | -4.912438 | 0.371099 | -13.238 | < 2e-16 | *** |
| brandMakita | -0.541428 | 0.141925 | -3.815 | 1.36E-04 | *** |
| brandMetabo | -4.42125 | 0.212003 | -20.855 | < 2e-16 | *** |
| brandMilwaukee | 0.285945 | 0.141155 | 2.026 | 0.042791 | * |
| brandPanasonic | -3.018758 | 0.173461 | -17.403 | < 2e-16 | *** |
| brandPorter Cable | -0.865996 | 0.143786 | -6.023 | 1.71E-09 | *** |
| brandPowermatic | -3.997 | 0.22328 | -17.901 | < 2e-16 | *** |
| brandRidgid | -2.039047 | 0.159401 | -12.792 | < 2e-16 | *** |
| brandRyobi | -3.776981 | 0.185432 | -20.369 | < 2e-16 | *** |
| brandSenco | -4.517897 | 0.177089 | -25.512 | < 2e-16 | *** |
| brandSkil | -0.905449 | 0.142004 | -6.376 | 1.81E-10 | *** |
| channelagg_channel | -3.275956 | 0.131051 | -24.997 | < 2e-16 | *** |

| | | | | | |
|--|-----------|----------|---------|----------|-----|
| channelAmazon Sales | -2.066272 | 0.120034 | -17.214 | < 2e-16 | *** |
| channeleBay Sales | -3.87458 | 0.127846 | -30.307 | < 2e-16 | *** |
| channelPhone | -1.33148 | 0.121011 | -11.003 | < 2e-16 | *** |
| ordered(inc).L | -1.672958 | 0.072691 | -23.015 | < 2e-16 | *** |
| ordered(inc).Q | 0.739884 | 0.074868 | 9.883 | < 2e-16 | *** |
| sexFemale | -1.715985 | 0.10175 | -16.865 | < 2e-16 | *** |
| sexNot Known | -1.951399 | 0.101541 | -19.218 | < 2e-16 | *** |
| cordlessNot Cordless | 2.053839 | 0.089228 | 23.018 | < 2e-16 | *** |
| condReconditioned | 0.139555 | 0.08692 | 1.606 | 0.108374 | |
| brandBlack & Decker:channelagg_channel | 0.654681 | 0.169091 | 3.872 | 1.08E-04 | *** |
| brandBostitch:channelagg_channel | 0.43093 | 0.199845 | 2.156 | 0.031058 | * |
| brandCampbell Hausfeld:channelagg_channel | 0.116411 | 0.193528 | 0.602 | 0.547492 | |
| brandDelta:channelagg_channel | -0.529681 | 0.240943 | -2.198 | 0.027923 | * |
| brandDewalt:channelagg_channel | 0.779317 | 0.157859 | 4.937 | 7.94E-07 | *** |
| brandFein:channelagg_channel | -0.180077 | 0.253542 | -0.71 | 0.477553 | |
| brandFestool:channelagg_channel | -0.130023 | 0.334922 | -0.388 | 6.98E-01 | |
| brandHomelite:channelagg_channel | 1.233865 | 0.246013 | 5.015 | 5.29E-07 | *** |
| brandJet:channelagg_channel | -0.600652 | 0.325004 | -1.848 | 0.064582 | . |
| brandKarcher:channelagg_channel | 0.831426 | 0.197502 | 4.21 | 2.56E-05 | *** |
| brandMakita:channelagg_channel | -0.831012 | 0.166272 | -4.998 | 5.80E-07 | *** |
| brandMetabo:channelagg_channel | -0.294359 | 0.280145 | -1.051 | 0.293379 | |
| brandMilwaukee:channelagg_channel | -0.392924 | 0.161027 | -2.44 | 0.014683 | * |
| brandPanasonic:channelagg_channel | 0.563648 | 0.263485 | 2.139 | 0.032419 | * |
| brandPorter Cable:channelagg_channel | 0.200587 | 0.162397 | 1.235 | 2.17E-01 | |
| brandPowermatic:channelagg_channel | 0.230159 | 0.415434 | 0.554 | 0.579565 | |
| brandRidgid:channelagg_channel | 0.927331 | 0.171251 | 5.415 | 6.13E-08 | *** |
| brandRyobi:channelagg_channel | 0.517785 | 0.177031 | 2.925 | 0.003446 | ** |
| brandSenco:channelagg_channel | 0.433431 | 0.209048 | 2.073 | 0.038139 | * |
| brandSkil:channelagg_channel | -0.272198 | 0.164201 | -1.658 | 0.097375 | . |
| brandBlack & Decker:channelAmazon Sales | 1.307686 | 0.148009 | 8.835 | < 2e-16 | *** |
| brandBostitch:channelAmazon Sales | 0.175789 | 0.183835 | 0.956 | 3.39E-01 | |
| brandCampbell Hausfeld:channelAmazon Sales | 0.13058 | 0.163239 | 0.8 | 0.423753 | |
| brandDelta:channelAmazon Sales | -0.144563 | 0.192543 | -0.751 | 0.452767 | |
| brandDewalt:channelAmazon Sales | -0.427042 | 0.150462 | -2.838 | 0.004537 | ** |
| brandFein:channelAmazon Sales | 0.286643 | 0.218446 | 1.312 | 1.89E-01 | |
| brandFestool:channelAmazon Sales | -0.257461 | 0.221821 | -1.161 | 2.46E-01 | |
| brandHomelite:channelAmazon Sales | 0.355377 | 0.237682 | 1.495 | 1.35E-01 | |
| brandJet:channelAmazon Sales | 0.776573 | 0.239188 | 3.247 | 0.001167 | ** |
| brandKarcher:channelAmazon Sales | 0.560474 | 0.182843 | 3.065 | 2.17E-03 | ** |
| brandMakita:channelAmazon Sales | -0.370133 | 0.148511 | -2.492 | 0.012692 | * |
| brandMetabo:channelAmazon Sales | -0.116221 | 0.198642 | -0.585 | 0.558495 | |
| brandMilwaukee:channelAmazon Sales | 0.012901 | 0.147632 | 0.087 | 0.930366 | |
| brandPanasonic:channelAmazon Sales | 1.082187 | 0.17894 | 6.048 | 1.47E-09 | *** |

| | | | | | |
|--|-----------|----------|--------|----------|-----|
| brandPorter Cable:channelAmazon Sales | -0.653628 | 0.151176 | -4.324 | 1.53E-05 | *** |
| brandPowermatic:channelAmazon Sales | 1.794149 | 0.259974 | 6.901 | 5.15E-12 | *** |
| brandRidgid:channelAmazon Sales | 0.233405 | 0.158374 | 1.474 | 0.140546 | |
| brandRyobi:channelAmazon Sales | 0.666398 | 0.16151 | 4.126 | 3.69E-05 | *** |
| brandSenco:channelAmazon Sales | 0.542687 | 0.169753 | 3.197 | 0.001389 | ** |
| brandSkil:channelAmazon Sales | -0.110959 | 0.148386 | -0.748 | 0.454595 | |
| brandBlack & Decker:channeleBay Sales | 1.841663 | 0.15379 | 11.975 | < 2e-16 | *** |
| brandBostitch:channeleBay Sales | 0.536528 | 0.192448 | 2.788 | 0.005305 | ** |
| brandCampbell Hausfeld:channeleBay Sales | 0.801435 | 0.173418 | 4.621 | 3.81E-06 | *** |
| brandDelta:channeleBay Sales | -1.982532 | 0.311473 | -6.365 | 1.95E-10 | *** |
| brandDewalt:channeleBay Sales | 0.313123 | 0.162024 | 1.933 | 0.053288 | . |
| brandFein:channeleBay Sales | 1.462071 | 0.201752 | 7.247 | 4.27E-13 | *** |
| brandFestool:channeleBay Sales | -1.390297 | 0.355223 | -3.914 | 9.08E-05 | *** |
| brandHomelite:channeleBay Sales | 1.990953 | 0.240056 | 8.294 | < 2e-16 | *** |
| brandJet:channeleBay Sales | 1.781779 | 0.248015 | 7.184 | 6.76E-13 | *** |
| brandKarcher:channeleBay Sales | 1.016796 | 0.190093 | 5.349 | 8.85E-08 | *** |
| brandMakita:channeleBay Sales | 0.335806 | 0.155209 | 2.164 | 0.030497 | * |
| brandMetabo:channeleBay Sales | 0.912767 | 0.215846 | 4.229 | 2.35E-05 | *** |
| brandMilwaukee:channeleBay Sales | 0.804129 | 0.153242 | 5.247 | 1.54E-07 | *** |
| brandPanasonic:channeleBay Sales | 1.248048 | 0.224154 | 5.568 | 2.58E-08 | *** |
| brandPorter Cable:channeleBay Sales | -0.368066 | 0.171319 | -2.148 | 0.031679 | * |
| brandPowermatic:channeleBay Sales | 1.095872 | 0.332125 | 3.3 | 9.68E-04 | *** |
| brandRidgid:channeleBay Sales | 1.533381 | 0.168365 | 9.107 | < 2e-16 | *** |
| brandRyobi:channeleBay Sales | 1.715806 | 0.166299 | 10.318 | < 2e-16 | *** |
| brandSenco:channeleBay Sales | 1.149298 | 0.185288 | 6.203 | 5.55E-10 | *** |
| brandSkil:channeleBay Sales | 0.586037 | 0.154629 | 3.79 | 0.000151 | *** |
| brandBlack & Decker:channelPhone | -0.595264 | 0.154038 | -3.864 | 0.000111 | *** |
| brandBostitch:channelPhone | -0.096868 | 0.185322 | -0.523 | 0.601184 | |
| brandCampbell Hausfeld:channelPhone | -0.370222 | 0.164858 | -2.246 | 0.024723 | * |
| brandDelta:channelPhone | 0.319053 | 0.194406 | 1.641 | 0.100763 | |
| brandDewalt:channelPhone | -0.529781 | 0.152619 | -3.471 | 0.000518 | *** |
| brandFein:channelPhone | -0.307907 | 0.198232 | -1.553 | 1.20E-01 | |
| brandFestool:channelPhone | 0.046707 | 0.224432 | 0.208 | 0.835143 | |
| brandHomelite:channelPhone | -0.409536 | 0.246077 | -1.664 | 0.096061 | . |
| brandJet:channelPhone | 0.417561 | 0.240084 | 1.739 | 0.081994 | . |
| brandKarcher:channelPhone | -0.363822 | 0.187381 | -1.942 | 0.052184 | . |
| brandMakita:channelPhone | -0.062341 | 0.148802 | -0.419 | 0.675252 | |
| brandMetabo:channelPhone | 0.437339 | 0.19044 | 2.296 | 2.16E-02 | * |
| brandMilwaukee:channelPhone | -0.183042 | 0.14892 | -1.229 | 0.219022 | |
| brandPanasonic:channelPhone | 0.03291 | 0.203331 | 0.162 | 0.871419 | |
| brandPorter Cable:channelPhone | -0.083768 | 0.150208 | -0.558 | 0.577062 | |
| brandPowermatic:channelPhone | 1.188814 | 0.263673 | 4.509 | 6.52E-06 | *** |
| brandRidgid:channelPhone | -0.428436 | 0.167077 | -2.564 | 0.010338 | * |

| | | | | | |
|---------------------------------------|-----------|----------|--------|----------|-----|
| brandRyobi:channelPhone | -0.781916 | 0.169206 | -4.621 | 3.82E-06 | *** |
| brandSenco:channelPhone | 0.160296 | 0.175723 | 0.912 | 0.36166 | |
| brandSkil:channelPhone | -0.400669 | 0.149885 | -2.673 | 0.007514 | ** |
| brandBlack & Decker:ordered(inc).L | 0.054144 | 0.085644 | 0.632 | 0.527261 | |
| brandBostitch:ordered(inc).L | 0.081323 | 0.10294 | 0.79 | 0.429527 | |
| brandCampbell Hausfeld:ordered(inc).L | 0.15084 | 0.095535 | 1.579 | 0.114359 | |
| brandDelta:ordered(inc).L | 0.136759 | 0.120535 | 1.135 | 0.256546 | |
| brandDewalt:ordered(inc).L | 0.075765 | 0.085408 | 0.887 | 0.375029 | |
| brandFein:ordered(inc).L | -0.032393 | 0.120595 | -0.269 | 0.788228 | |
| brandFestool:ordered(inc).L | -0.036987 | 0.152583 | -0.242 | 0.808468 | |
| brandHomelite:ordered(inc).L | 0.126704 | 0.131005 | 0.967 | 0.333462 | |
| brandJet:ordered(inc).L | 0.096537 | 0.139364 | 0.693 | 0.488499 | |
| brandKarcher:ordered(inc).L | -0.110593 | 0.103601 | -1.067 | 0.285749 | |
| brandMakita:ordered(inc).L | 0.066668 | 0.08516 | 0.783 | 0.433713 | |
| brandMetabo:ordered(inc).L | 0.273352 | 0.121288 | 2.254 | 0.024213 | * |
| brandMilwaukee:ordered(inc).L | 0.050461 | 0.083728 | 0.603 | 0.546724 | |
| brandPanasonic:ordered(inc).L | 0.136153 | 0.124873 | 1.09 | 0.275568 | |
| brandPorter Cable:ordered(inc).L | 0.112991 | 0.087224 | 1.295 | 0.19518 | |
| brandPowermatic:ordered(inc).L | -0.159621 | 0.164534 | -0.97 | 0.331976 | |
| brandRidgid:ordered(inc).L | 0.062906 | 0.091063 | 0.691 | 0.489694 | |
| brandRyobi:ordered(inc).L | 0.066408 | 0.092212 | 0.72 | 0.471421 | |
| brandSenco:ordered(inc).L | 0.085869 | 0.101563 | 0.845 | 0.397845 | |
| brandSkil:ordered(inc).L | 0.13014 | 0.084503 | 1.54 | 0.123545 | |
| brandBlack & Decker:ordered(inc).Q | -0.090691 | 0.088355 | -1.026 | 3.05E-01 | |
| brandBostitch:ordered(inc).Q | 0.128731 | 0.106651 | 1.207 | 0.227421 | |
| brandCampbell Hausfeld:ordered(inc).Q | -0.01705 | 0.100066 | -0.17 | 8.65E-01 | |
| brandDelta:ordered(inc).Q | 0.081546 | 0.126276 | 0.646 | 0.518425 | |
| brandDewalt:ordered(inc).Q | 0.283132 | 0.090353 | 3.134 | 1.73E-03 | ** |
| brandFein:ordered(inc).Q | -0.149323 | 0.125275 | -1.192 | 2.33E-01 | |
| brandFestool:ordered(inc).Q | -0.315734 | 0.149073 | -2.118 | 3.42E-02 | * |
| brandHomelite:ordered(inc).Q | 0.031918 | 0.133996 | 0.238 | 0.811727 | |
| brandJet:ordered(inc).Q | 0.271626 | 0.145765 | 1.863 | 6.24E-02 | . |
| brandKarcher:ordered(inc).Q | -0.366359 | 0.105046 | -3.488 | 0.000487 | *** |
| brandMakita:ordered(inc).Q | 0.08092 | 0.087871 | 0.921 | 3.57E-01 | |
| brandMetabo:ordered(inc).Q | 0.087904 | 0.128558 | 0.684 | 0.494123 | |
| brandMilwaukee:ordered(inc).Q | 0.260175 | 0.086852 | 2.996 | 2.74E-03 | ** |
| brandPanasonic:ordered(inc).Q | -0.024035 | 0.13346 | -0.18 | 0.857083 | |
| brandPorter Cable:ordered(inc).Q | 0.115783 | 0.090635 | 1.277 | 0.20144 | |
| brandPowermatic:ordered(inc).Q | 0.136085 | 0.175919 | 0.774 | 0.439188 | |
| brandRidgid:ordered(inc).Q | 0.129681 | 0.098269 | 1.32 | 0.186949 | |
| brandRyobi:ordered(inc).Q | -0.004645 | 0.095974 | -0.048 | 0.961401 | |
| brandSenco:ordered(inc).Q | 0.267821 | 0.111221 | 2.408 | 1.60E-02 | * |
| brandSkil:ordered(inc).Q | 0.141293 | 0.088136 | 1.603 | 0.108906 | |

| | | | | | |
|---|-----------|----------|---------|----------|-----|
| brandBlack & Decker:sexFemale | 0.990301 | 0.120944 | 8.188 | 2.65E-16 | *** |
| brandBostitch:sexFemale | 0.235018 | 0.149289 | 1.574 | 0.115431 | |
| brandCampbell Hausfeld:sexFemale | 0.391857 | 0.134894 | 2.905 | 0.003673 | ** |
| brandDelta:sexFemale | -0.183216 | 0.171861 | -1.066 | 0.286391 | |
| brandDewalt:sexFemale | 0.126885 | 0.122138 | 1.039 | 0.298871 | |
| brandFein:sexFemale | 0.369436 | 0.168516 | 2.192 | 2.84E-02 | * |
| brandFestool:sexFemale | -0.308035 | 0.205362 | -1.5 | 0.133624 | |
| brandHomelite:sexFemale | 0.332505 | 0.188237 | 1.766 | 0.077326 | . |
| brandJet:sexFemale | -0.371355 | 0.201993 | -1.838 | 0.065996 | . |
| brandKarcher:sexFemale | 0.455684 | 0.147282 | 3.094 | 0.001975 | ** |
| brandMakita:sexFemale | 0.163356 | 0.121237 | 1.347 | 0.177845 | |
| brandMetabo:sexFemale | -0.030635 | 0.173766 | -0.176 | 0.860056 | |
| brandMilwaukee:sexFemale | -0.068785 | 0.11962 | -0.575 | 0.565271 | |
| brandPanasonic:sexFemale | -0.055627 | 0.173684 | -0.32 | 0.748758 | |
| brandPorter Cable:sexFemale | 0.126443 | 0.124425 | 1.016 | 0.309525 | |
| brandPowermatic:sexFemale | -0.815836 | 0.240427 | -3.393 | 0.000691 | *** |
| brandRidgid:sexFemale | -0.009212 | 0.130631 | -0.071 | 0.943781 | |
| brandRyobi:sexFemale | 0.367468 | 0.131242 | 2.8 | 0.005111 | ** |
| brandSenco:sexFemale | 0.025625 | 0.14553 | 0.176 | 0.860228 | |
| brandSkil:sexFemale | 0.569505 | 0.120003 | 4.746 | 2.08E-06 | *** |
| brandBlack & Decker:sexNot Known | 0.198516 | 0.122148 | 1.625 | 0.104118 | |
| brandBostitch:sexNot Known | -0.006187 | 0.148109 | -0.042 | 0.966679 | |
| brandCampbell Hausfeld:sexNot Known | -0.004125 | 0.136865 | -0.03 | 0.975954 | |
| brandDelta:sexNot Known | -0.209137 | 0.171468 | -1.22 | 0.222583 | |
| brandDewalt:sexNot Known | -0.087868 | 0.122011 | -0.72 | 0.471423 | |
| brandFein:sexNot Known | 0.008667 | 0.1703 | 0.051 | 0.959411 | |
| brandFestool:sexNot Known | 0.102434 | 0.201261 | 0.509 | 0.610779 | |
| brandHomelite:sexNot Known | -0.048082 | 0.186803 | -0.257 | 0.796872 | |
| brandJet:sexNot Known | -0.140041 | 0.199847 | -0.701 | 0.483464 | |
| brandKarcher:sexNot Known | 0.058267 | 0.148791 | 0.392 | 0.695349 | |
| brandMakita:sexNot Known | 0.094938 | 0.120299 | 0.789 | 0.430004 | |
| brandMetabo:sexNot Known | 0.176733 | 0.165476 | 1.068 | 0.285508 | |
| brandMilwaukee:sexNot Known | -0.176813 | 0.118757 | -1.489 | 0.136523 | |
| brandPanasonic:sexNot Known | 0.268847 | 0.165817 | 1.621 | 0.104942 | |
| brandPorter Cable:sexNot Known | -0.222971 | 0.123399 | -1.807 | 0.070777 | . |
| brandPowermatic:sexNot Known | -0.436058 | 0.233165 | -1.87 | 0.061461 | . |
| brandRidgid:sexNot Known | -0.155358 | 0.130405 | -1.191 | 0.233517 | |
| brandRyobi:sexNot Known | 0.030701 | 0.131651 | 0.233 | 0.815608 | |
| brandSenco:sexNot Known | -0.160677 | 0.14677 | -1.095 | 0.273627 | |
| brandSkil:sexNot Known | -0.101525 | 0.121021 | -0.839 | 0.401525 | |
| brandBlack & Decker:cordlessNot Cordless | -1.383039 | 0.100497 | -13.762 | < 2e-16 | *** |
| brandBostitch:cordlessNot Cordless | NA | NA | NA | NA | |
| brandCampbell Hausfeld:cordlessNot Cordless | 1.565218 | 0.128224 | 12.207 | < 2e-16 | *** |

| | | | | | |
|--|-----------|----------|---------|----------|-----|
| brandDelta:cordlessNot Cordless | NA | NA | NA | NA | |
| brandDewalt:cordlessNot Cordless | -1.00721 | 0.100709 | -10.001 | < 2e-16 | *** |
| brandFein:cordlessNot Cordless | 2.640616 | 0.244366 | 10.806 | < 2e-16 | *** |
| brandFestool:cordlessNot Cordless | 1.81401 | 0.210492 | 8.618 | < 2e-16 | *** |
| brandHomelite:cordlessNot Cordless | NA | NA | NA | NA | |
| brandJet:cordlessNot Cordless | NA | NA | NA | NA | |
| brandKarcher:cordlessNot Cordless | 2.737791 | 0.356577 | 7.678 | 1.62E-14 | *** |
| brandMakita:cordlessNot Cordless | -0.526343 | 0.099667 | -5.281 | 1.28E-07 | *** |
| brandMetabo:cordlessNot Cordless | 1.726152 | 0.203445 | 8.485 | < 2e-16 | *** |
| brandMilwaukee:cordlessNot Cordless | -1.230661 | 0.098228 | -12.529 | < 2e-16 | *** |
| brandPanasonic:cordlessNot Cordless | -2.351996 | 0.137063 | -17.16 | < 2e-16 | *** |
| brandPorter Cable:cordlessNot Cordless | -0.128396 | 0.102877 | -1.248 | 0.212012 | |
| brandPowermatic:cordlessNot Cordless | NA | NA | NA | NA | |
| brandRidgid:cordlessNot Cordless | -1.15662 | 0.110212 | -10.495 | < 2e-16 | *** |
| brandRyobi:cordlessNot Cordless | 1.04534 | 0.123895 | 8.437 | < 2e-16 | *** |
| brandSenco:cordlessNot Cordless | 0.874897 | 0.13418 | 6.52 | 7.02E-11 | *** |
| brandSkil:cordlessNot Cordless | 0.068686 | 0.099919 | 0.687 | 0.491817 | |
| brandBlack & Decker:condReconditioned | 0.336607 | 0.101308 | 3.323 | 0.000892 | *** |
| brandBostitch:condReconditioned | 0.934762 | 0.123307 | 7.581 | 3.44E-14 | *** |
| brandCampbell Hausfeld:condReconditioned | -0.295383 | 0.111687 | -2.645 | 0.008175 | ** |
| brandDelta:condReconditioned | -2.026814 | 0.143395 | -14.134 | < 2e-16 | *** |
| brandDewalt:condReconditioned | -0.629044 | 0.100795 | -6.241 | 4.35E-10 | *** |
| brandFein:condReconditioned | -1.971366 | 0.156764 | -12.575 | < 2e-16 | *** |
| brandFestool:condReconditioned | NA | NA | NA | NA | |
| brandHomelite:condReconditioned | 6.697304 | 0.495862 | 13.506 | < 2e-16 | *** |
| brandJet:condReconditioned | NA | NA | NA | NA | |
| brandKarcher:condReconditioned | 0.433875 | 0.122933 | 3.529 | 0.000417 | *** |
| brandMakita:condReconditioned | 0.213316 | 0.099651 | 2.141 | 3.23E-02 | * |
| brandMetabo:condReconditioned | -2.015525 | 0.15413 | -13.077 | < 2e-16 | *** |
| brandMilwaukee:condReconditioned | -0.209517 | 0.098215 | -2.133 | 0.032905 | * |
| brandPanasonic:condReconditioned | -1.312138 | 0.139269 | -9.422 | < 2e-16 | *** |
| brandPorter Cable:condReconditioned | 0.013779 | 0.103445 | 0.133 | 0.894036 | |
| brandPowermatic:condReconditioned | NA | NA | NA | NA | |
| brandRidgid:condReconditioned | 0.631481 | 0.111912 | 5.643 | 1.67E-08 | *** |
| brandRyobi:condReconditioned | 2.090495 | 0.124782 | 16.753 | < 2e-16 | *** |
| brandSenco:condReconditioned | 0.757828 | 0.123308 | 6.146 | 7.96E-10 | *** |
| brandSkil:condReconditioned | 0.229937 | 0.099534 | 2.31 | 2.09E-02 | * |
| channelagg_channel:ordered(inc).L | 0.093732 | 0.057304 | 1.636 | 1.02E-01 | |
| channelAmazon Sales:ordered(inc).L | -0.01665 | 0.049441 | -0.337 | 0.736302 | |
| channelBay Sales:ordered(inc).L | 0.131704 | 0.052642 | 2.502 | 0.012354 | * |
| channelPhone:ordered(inc).L | 0.10703 | 0.050189 | 2.133 | 0.032962 | * |
| channelagg_channel:ordered(inc).Q | -0.056519 | 0.061706 | -0.916 | 0.359696 | |
| channelAmazon Sales:ordered(inc).Q | -0.194782 | 0.05047 | -3.859 | 0.000114 | *** |

| | | | | | |
|--|-----------|----------|--------|----------|-----|
| channeleBay Sales:ordered(inc).Q | 0.394934 | 0.056678 | 6.968 | 3.21E-12 | *** |
| channelPhone:ordered(inc).Q | 0.147269 | 0.052645 | 2.797 | 5.15E-03 | ** |
| channelagg_channel:sexFemale | -0.553004 | 0.083302 | -6.639 | 3.17E-11 | *** |
| channelAmazon Sales:sexFemale | 0.562195 | 0.069313 | 8.111 | 5.02E-16 | *** |
| channeleBay Sales:sexFemale | 0.195726 | 0.075193 | 2.603 | 0.009242 | ** |
| channelPhone:sexFemale | -0.036688 | 0.070912 | -0.517 | 0.604895 | |
| channelagg_channel:sexNot Known | 0.024818 | 0.080804 | 0.307 | 0.75874 | |
| channelAmazon Sales:sexNot Known | 0.510151 | 0.069851 | 7.303 | 2.81E-13 | *** |
| channeleBay Sales:sexNot Known | 0.437712 | 0.075268 | 5.815 | 6.05E-09 | *** |
| channelPhone:sexNot Known | -0.053366 | 0.071804 | -0.743 | 4.57E-01 | |
| channelagg_channel:cordlessNot Cordless | -0.620028 | 0.077355 | -8.015 | 1.10E-15 | *** |
| channelAmazon Sales:cordlessNot Cordless | -0.066871 | 0.065252 | -1.025 | 0.305451 | |
| channeleBay Sales:cordlessNot Cordless | -0.0254 | 0.0718 | -0.354 | 0.723524 | |
| channelPhone:cordlessNot Cordless | 0.003316 | 0.067399 | 0.049 | 0.960762 | |
| channelagg_channel:condReconditioned | 1.411591 | 0.071485 | 19.747 | < 2e-16 | *** |
| channelAmazon Sales:condReconditioned | 0.940418 | 0.060727 | 15.486 | < 2e-16 | *** |
| channeleBay Sales:condReconditioned | 1.543654 | 0.065875 | 23.433 | < 2e-16 | *** |
| channelPhone:condReconditioned | -0.1824 | 0.061901 | -2.947 | 0.003212 | ** |
| ordered(inc).L:sexFemale | 0.171197 | 0.040739 | 4.202 | 2.64E-05 | *** |
| ordered(inc).Q:sexFemale | 0.208683 | 0.043794 | 4.765 | 1.89E-06 | *** |
| ordered(inc).L:sexNot Known | 0.075262 | 0.041337 | 1.821 | 6.87E-02 | . |
| ordered(inc).Q:sexNot Known | -0.039992 | 0.043141 | -0.927 | 0.353925 | |
| ordered(inc).L:condReconditioned | -0.016475 | 0.035746 | -0.461 | 0.644871 | |
| ordered(inc).Q:condReconditioned | 0.121235 | 0.037967 | 3.193 | 0.001407 | ** |
| sexFemale:cordlessNot Cordless | -0.15221 | 0.054911 | -2.772 | 0.005572 | ** |
| sexNot Known:cordlessNot Cordless | -0.102282 | 0.055358 | -1.848 | 0.064651 | . |
| sexFemale:condReconditioned | -0.489354 | 0.050805 | -9.632 | < 2e-16 | *** |
| sexNot Known:condReconditioned | -0.106814 | 0.050918 | -2.098 | 0.035926 | * |
| cordlessNot Cordless:condReconditioned | -0.469608 | 0.048931 | -9.597 | < 2e-16 | *** |

Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1

(Dispersion parameter for poisson family taken to be 1)

Null deviance: 31161.3 on 2489 degrees of freedom

Residual deviance: 2132.1 on 2232 degrees of freedom

AIC: 4599.6

Number of Fisher Scoring iterations: 5